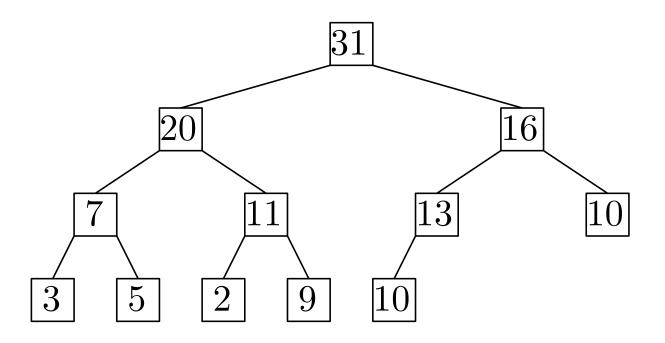
# Prioritetskøer, hobe og heap sort

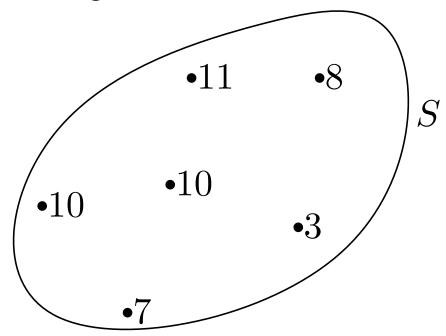


Mikkel Abrahamsen

Dynamisk multi-mængde S af *nøgler*.

To (vigtigste) operationer:

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



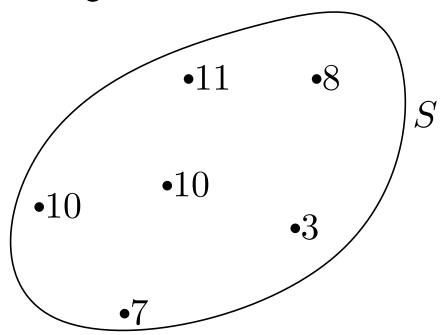
Dynamisk multi-mængde S af *nøgler*.

To (vigtigste) operationer:

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

• Insert(S, k): tilføj k til S.

Extract-Max(S)



Dynamisk multi-mængde S af *nøgler*.

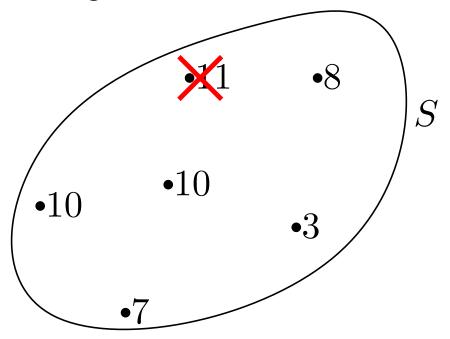
To (vigtigste) operationer:

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

• Insert(S, k): tilføj k til S.

 $\mathsf{Extract} ext{-}\mathsf{Max}(S)$ 

returnér 11



Dynamisk multi-mængde S af *nøgler*.

To (vigtigste) operationer:

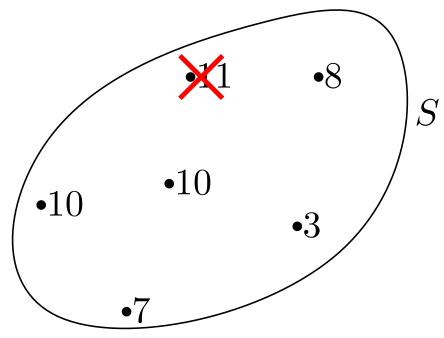
• Extract-Max(S): fjern og returnér største nøgle.

• Insert(S, k): tilføj k til S.

Extract-Max(S)

returnér 11

Extract-Max(S)



Dynamisk multi-mængde S af *nøgler*.

To (vigtigste) operationer:

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

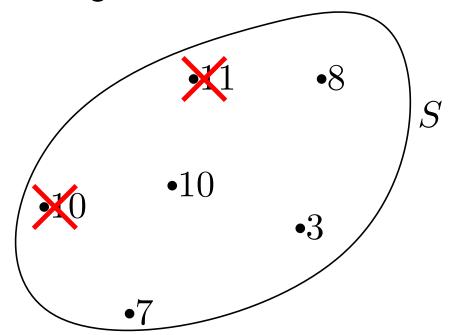
• Insert(S, k): tilføj k til S.

Extract-Max(S)

returnér 11

Extract-Max(S)

returnér 10



Dynamisk multi-mængde S af *nøgler*.

To (vigtigste) operationer:

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

• Insert(S, k): tilføj k til S.

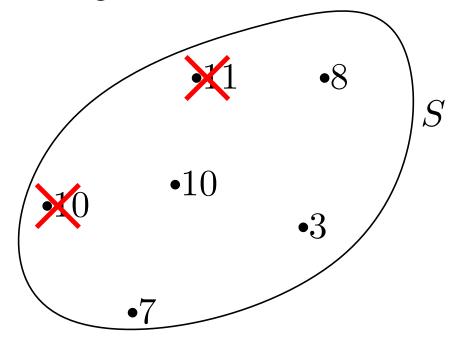
Extract-Max(S)

returnér 11

Extract-Max(S)

returnér 10

Insert(S, 13)



Dynamisk multi-mængde S af *nøgler*.

To (vigtigste) operationer:

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

• Insert(S, k): tilføj k til S.

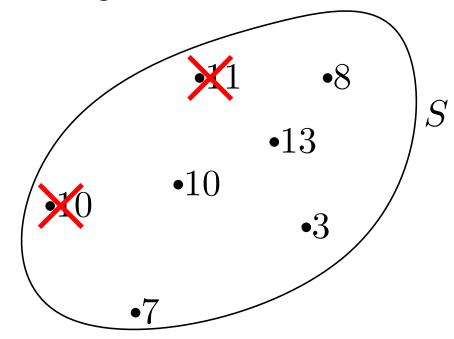
Extract-Max(S)

returnér 11

Extract-Max(S)

returnér 10

Insert(S, 13)



Dynamisk multi-mængde S af *nøgler*.

To (vigtigste) operationer:

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

• Insert(S, k): tilføj k til S.

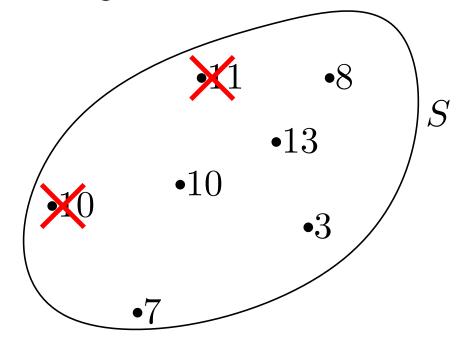
Extract-Max(S)

returnér 11

Extract-Max(S)

returnér 10

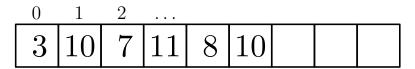
Insert(S, 13)



I praksis: Vi gemmer hver nøgle sammen med sattelitdata: (k, data)

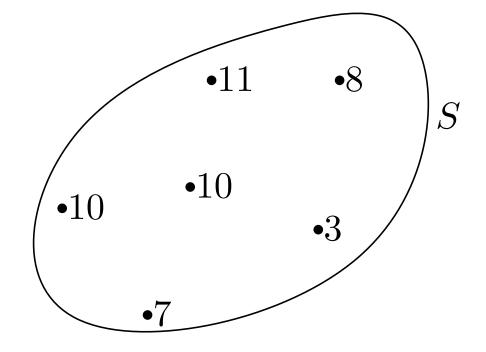
#### Kendte teknikker

#### Array:



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

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



#### Kendte teknikker

#### Array:

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

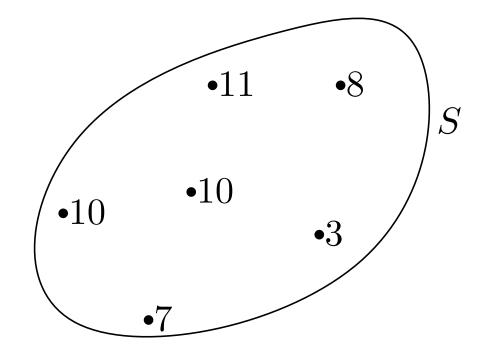
Insert(S, k):  $\Theta(1)$  tid.

#### Sorteret array:

0	1	2					
3	7	8	10	10	11		

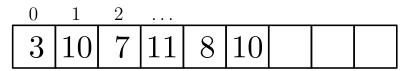
Extract-Max(S):  $\Theta(1)$  tid.

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



#### Kendte teknikker

#### Array:



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.

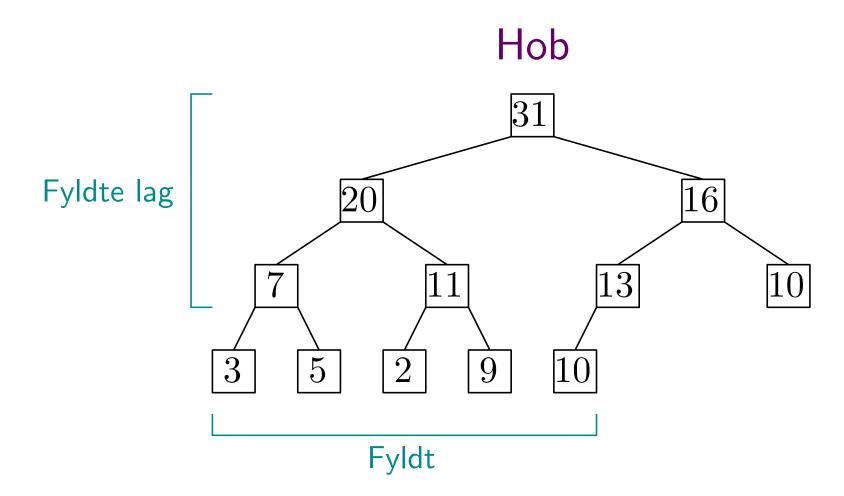
# •11 •8 S •10 •3

#### Hægtet liste:



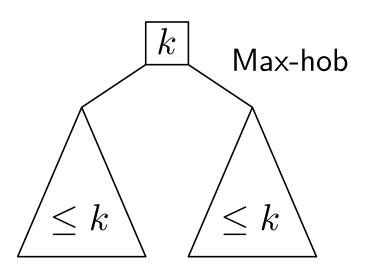
Extract-Max(S):  $\Theta(n)$  tid.

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



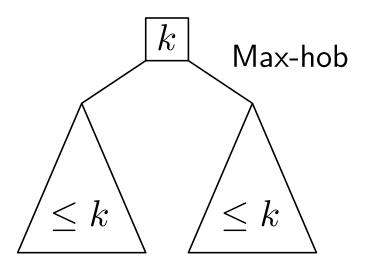
## Hob Fyldte lag |10|Fyldt

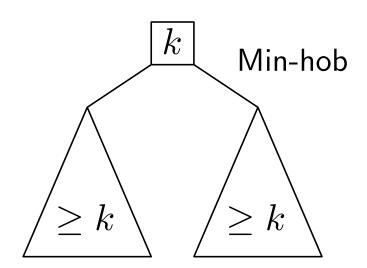
#### Hobeordenen:



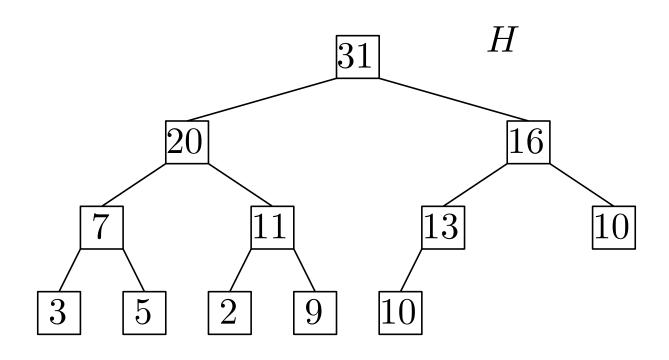
## Hob Fyldte lag |10|Fyldt

#### Hobeordenen:



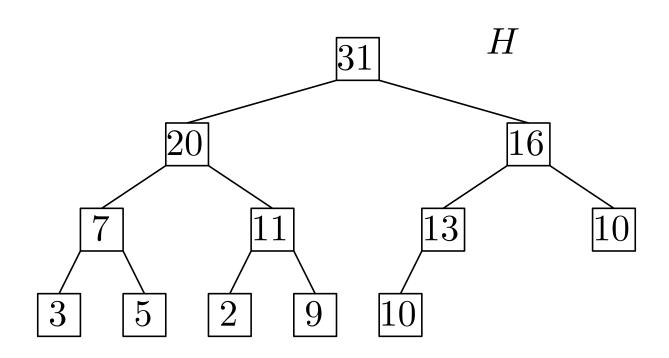


Extract-Max(H)



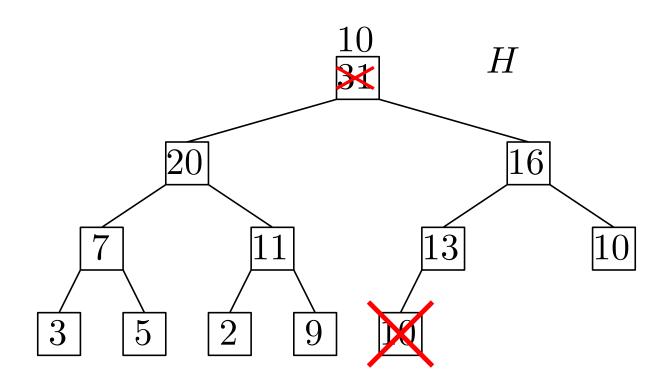
Extract-Max(H)

$$max = 31$$



Extract-Max(H)

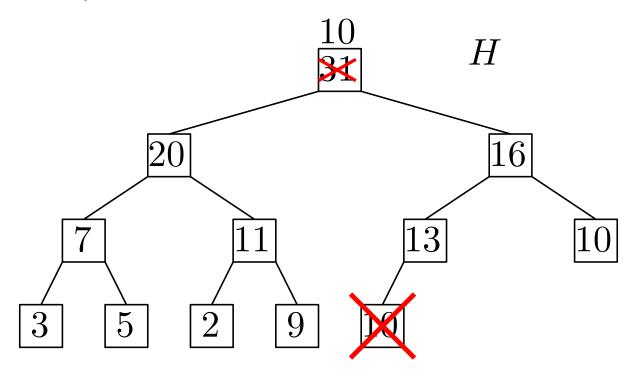
$$max = 31$$



Extract-Max(H)

max = 31

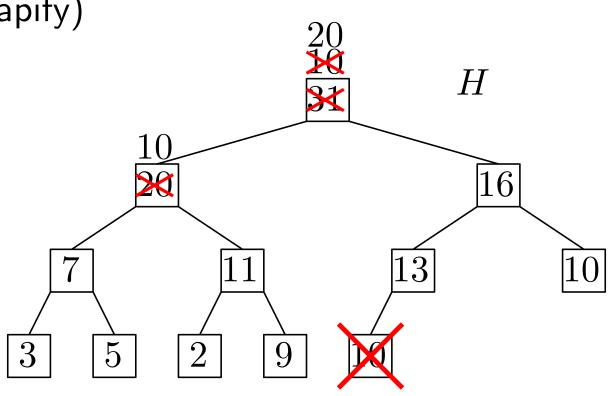
10 "bobler ned" (Max-Heapify)



Extract-Max(H)

max = 31

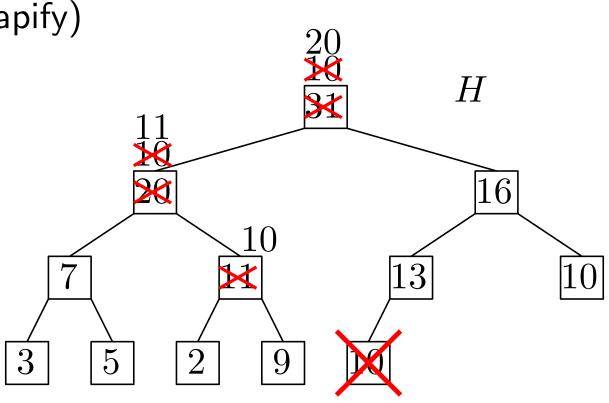
10 "bobler ned" (Max-Heapify)



Extract-Max(H)

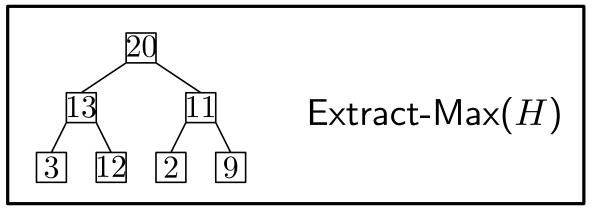
max = 31

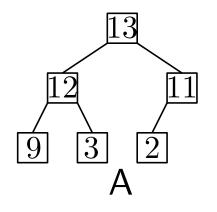
10 "bobler ned" (Max-Heapify)

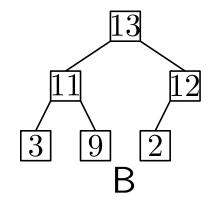


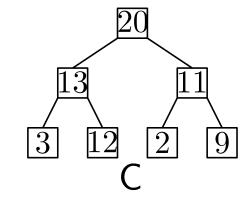
# Extract-Max(H)max = 3110 "bobler ned" (Max-Heapify) return maxH13

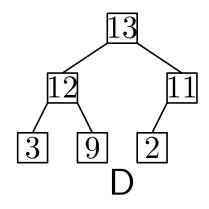
#### Hvordan ser hoben ud til sidst?

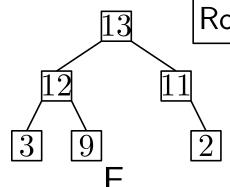








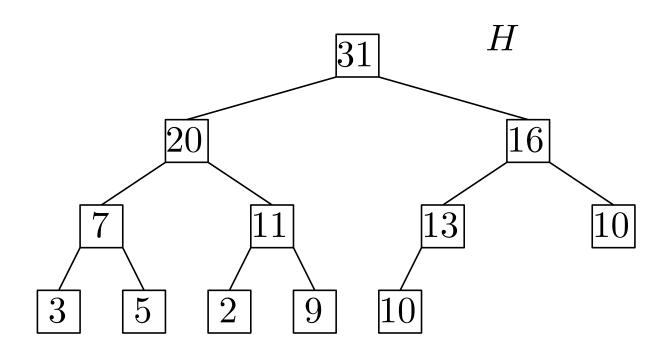




socrative.com  $\rightarrow$  Student login, Room name: ABRAHAMSEN3464

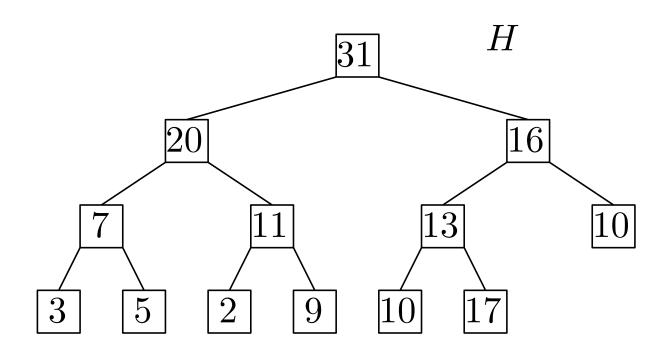
Insert

Insert(H, 17)



Insert

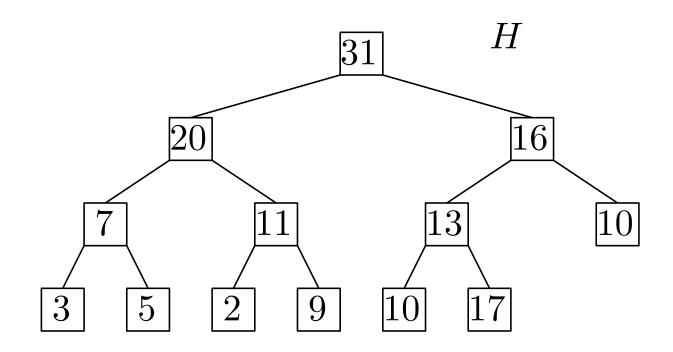
Insert(H, 17)



## Insert

Insert(H, 17)

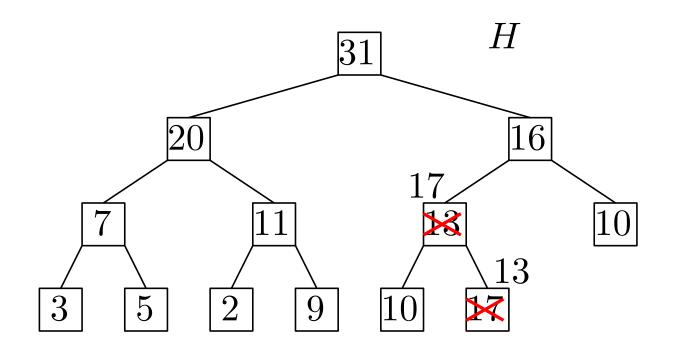
17 "bobler op"



## Insert

Insert(H, 17)

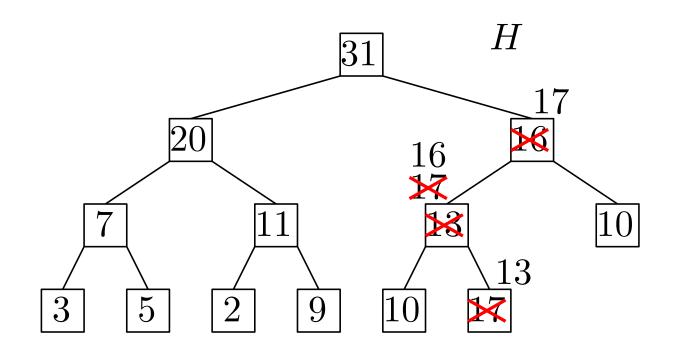
17 "bobler op"



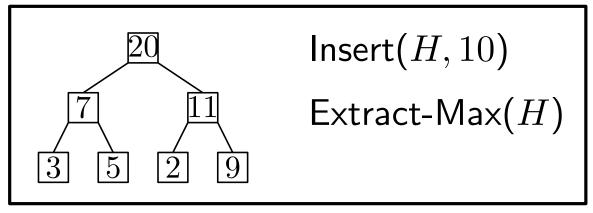
## Insert

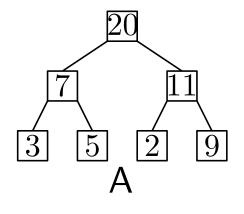
Insert(H, 17)

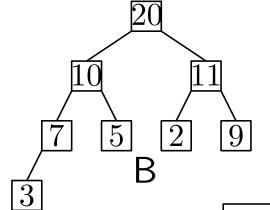
17 "bobler op"

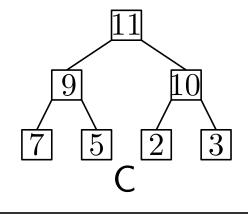


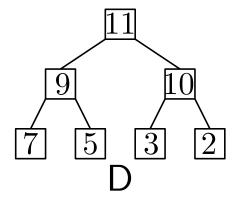
#### Hvordan ser hoben ud til sidst?

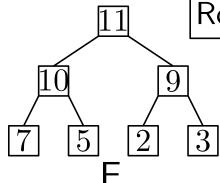












socrative.com  $\rightarrow$  Student login, Room name: ABRAHAMSEN3464

Insert: Boble op

Extract-Max: Boble ned

Insert: Boble op

Extract-Max: Boble ned

Insert: Boble op

Extract-Max: Boble ned

$$n = 2^0 = 1$$

$$h = 0$$

Insert: Boble op

Extract-Max: Boble ned

$$n = 2^0 = 1$$

$$h = 0$$

$$n = 2^1 = 2$$

$$h = 1$$

Insert: Boble op

Extract-Max: Boble ned

$$n = 2^0 = 1$$
$$h = 0$$

$$n = 2^1 = 2$$

$$h = 1$$

$$n = 2^2 = 4$$

$$h = 2$$

Insert: Boble op

Extract-Max: Boble ned

$$n = 2^0 = 1$$
$$h = 0$$

$$n = 2^3 = 8$$

$$h = 3$$

$$n = 2^1 = 2$$

$$h = 1$$

$$n = 2^2 = 4$$

$$h = 2$$

Insert: Boble op

Extract-Max: Boble ned

$$n = 2^0 = 1$$
$$h = 0$$

$$n = 2^3 = 8$$

$$h = 3$$

$$n = 2^{1} = 2$$

$$h = 1$$

$$n = 2^{4} = 16$$

$$h = 4$$

$$n = 2^2 = 4$$

$$h = 2$$

Insert: Boble op

Extract-Max: Boble ned

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

$$n = 2^0 = 1$$

$$h = 0$$

$$n = 2^{3} = 8$$

$$h = 3$$

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

$$n = 2^{1} = 2$$

$$h = 1$$

$$n = 2^{4} = 16$$

$$h = 4$$

$$n = 2^2 = 4$$

$$h = 2$$

Insert: Boble op

Extract-Max: Boble ned

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

$$n = 2^0 = 1$$

$$h = 0$$

$$n = 2^{3} = 8$$

$$h = 3$$

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

$$n = 2^{1} = 2$$

$$h = 1$$

$$n = 2^{4} = 16$$

$$h = 4$$

$$n = 2^2 = 4$$

$$h = 2$$

Insert: Boble op

Extract-Max: Boble ned

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

$$n = 2^0 = 1$$
$$h = 0$$

$$n = 2^{3} = 8$$

$$h = 3$$

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

$$n = 2^1 = 2$$

$$h = 1$$

$$n = 2^4 = 16$$

$$h = 4$$

$$n = 2^2 = 4$$

$$h = 2$$

Insert: Boble op

Extract-Max: Boble ned

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

$$n = 2^0 = 1$$
$$h = 0$$

$$n = 2^3 = 8$$

$$h = 3$$

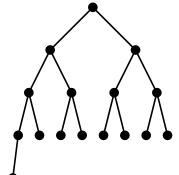
$$1 + 1 + 2 + 4 + \dots + 2^{h-1}$$

$$n = 2^1 = 2$$

$$h = 1$$

$$n = 2^4 = 16$$

$$h = 4$$



$$n = 2^2 = 4$$

$$h = 2$$

Insert: Boble op

Extract-Max: Boble ned

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

$$n = 2^0 = 1$$
$$h = 0$$

$$n = 2^{3} = 8$$

$$h = 3$$

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

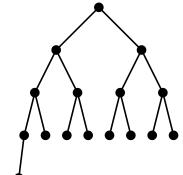
 $2^h$ 

$$n = 2^1 = 2$$

$$h = 1$$

$$n = 2^4 = 16$$

$$h = 4$$



$$n = 2^2 = 4$$

$$h = 2$$

Insert: Boble op

Extract-Max: Boble ned

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

$$n = 2^0 = 1$$

$$h = 0$$

$$n = 2^{3} = 8$$

$$h = 3$$

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

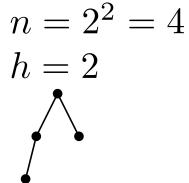
 $2^h$ 

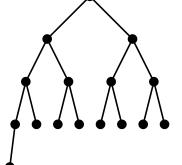
$$n = 2^1 = 2$$

$$h = 1$$

$$n = 2^4 = 16$$

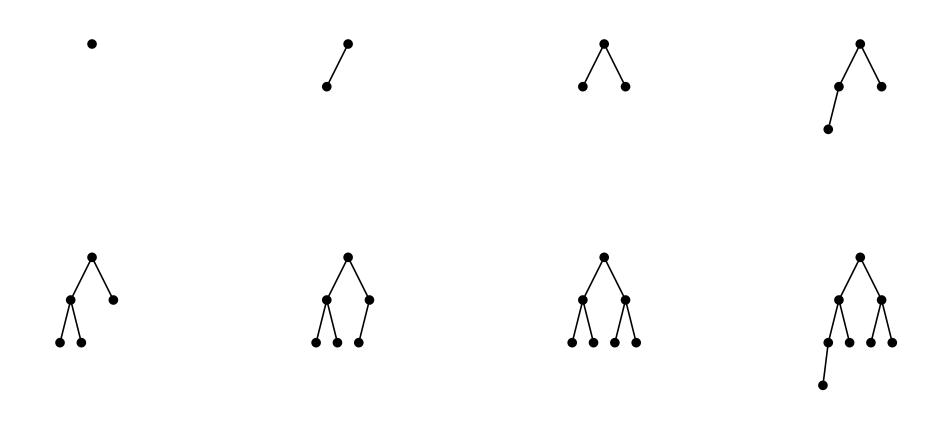
$$h = 4$$



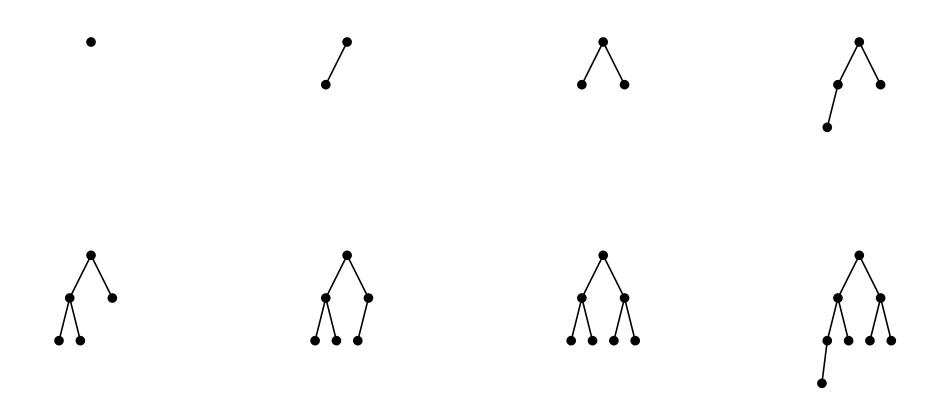


$$h = \lfloor \lg n \rfloor$$
, så  $T(n) = \Theta(\log n)$ .

## Hvor mange blade er der?

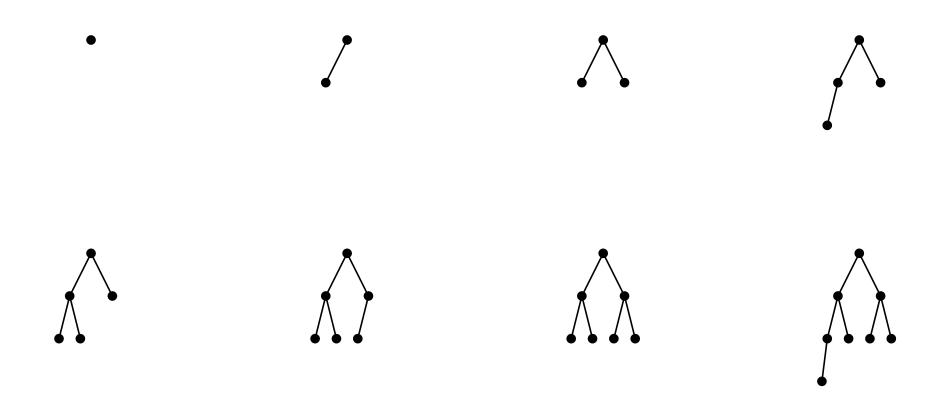


## Hvor mange blade er der?



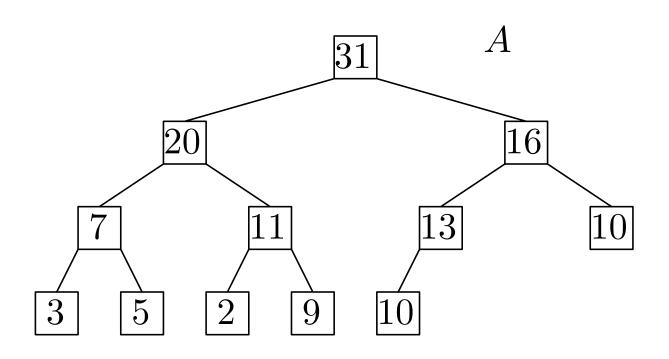
Hver anden gang vi tilføjer en knude er antallet uændret, de andre gange vokser det med én. Derfor: #blade  $= \lceil \frac{n}{2} \rceil$ .

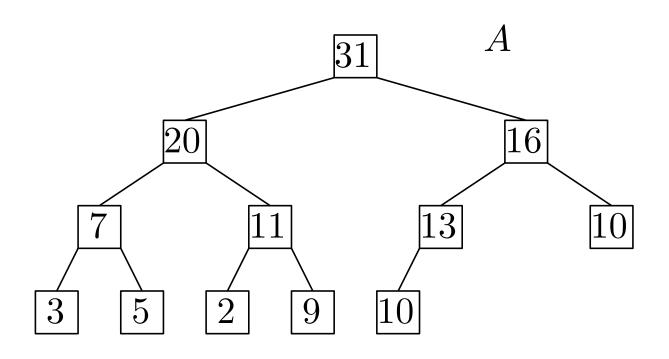
#### Hvor mange blade er der?

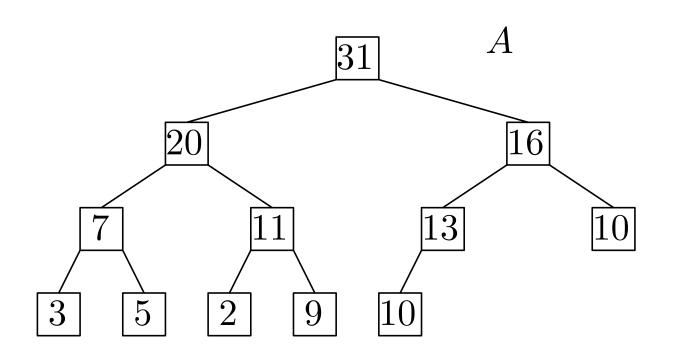


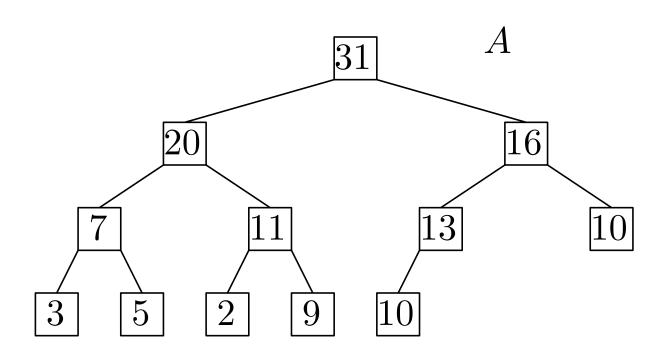
Hver anden gang vi tilføjer en knude er antallet uændret, de andre gange vokser det med én. Derfor: #blade  $= \lceil \frac{n}{2} \rceil$ .

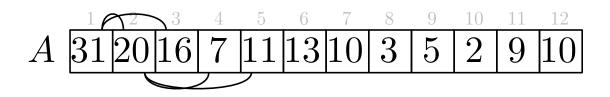
$$\mathsf{H}\mathsf{øjde} = \lfloor \lg n \rfloor$$
 $\mathsf{Blade} = \lceil \frac{n}{2} \rceil$ 

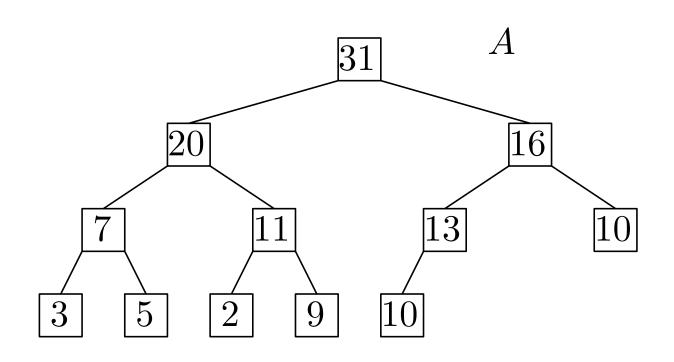


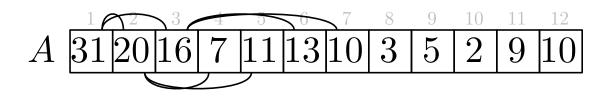


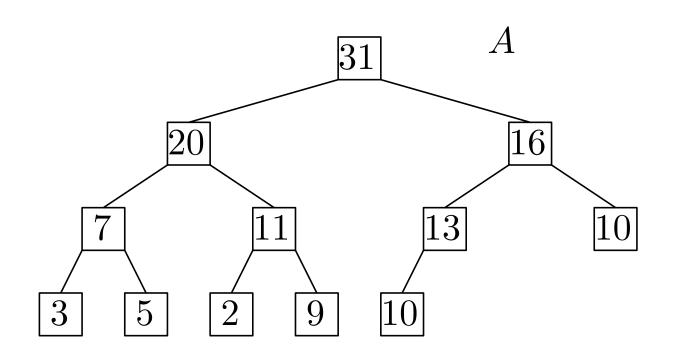


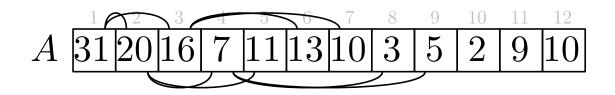


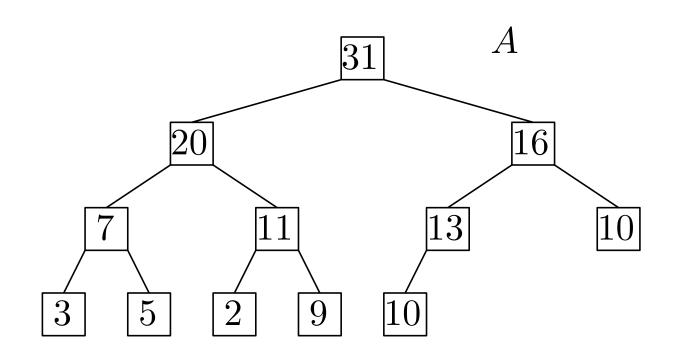


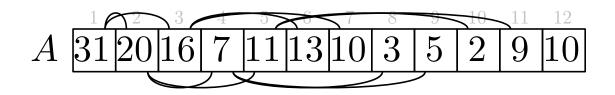


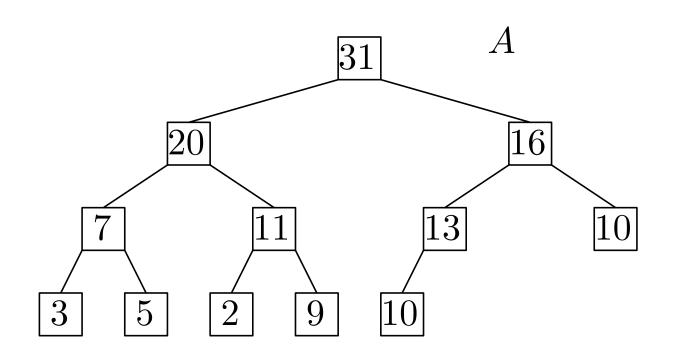


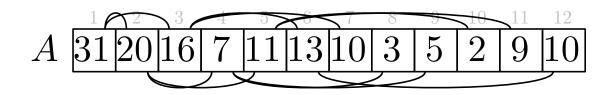


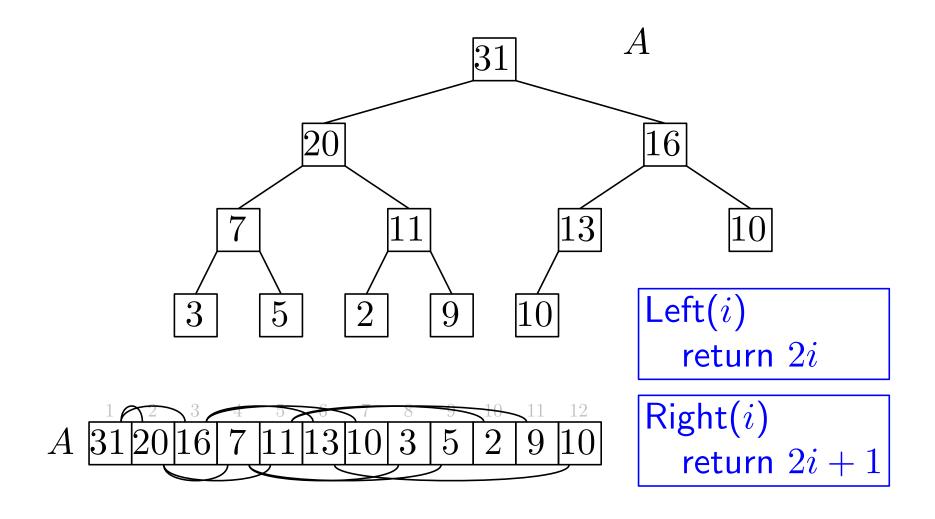


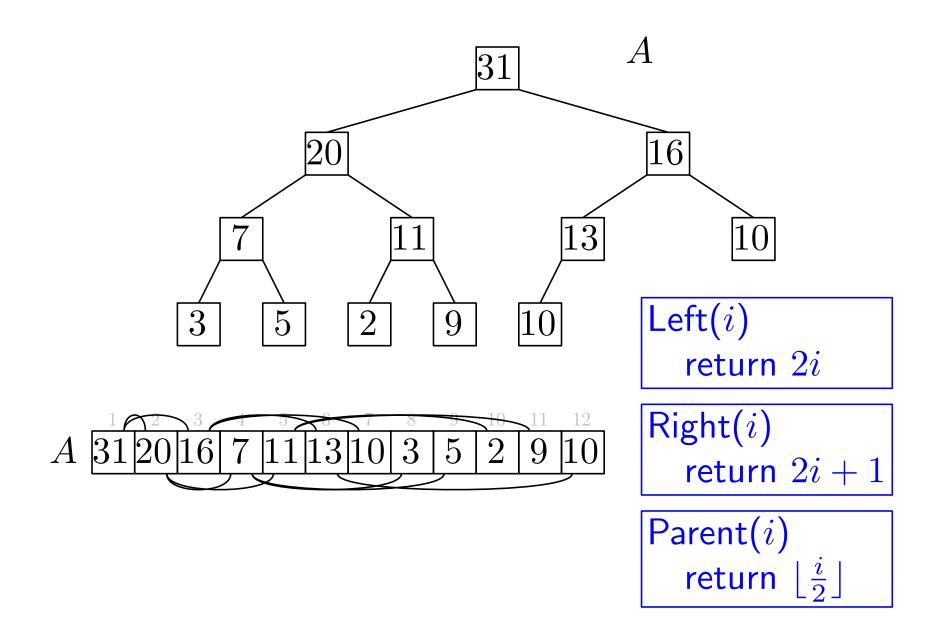








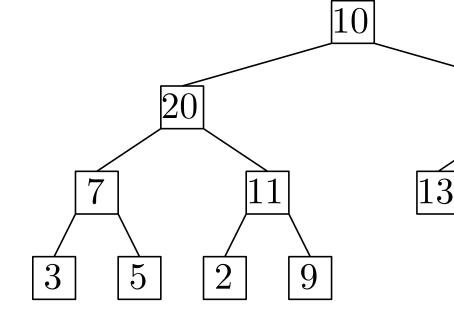




## Max-Heapify

Vi lader 10 "boble ned". Max-Heapify(A, 1)

Max-Heapify(A, i)



```
l = \operatorname{Left}(i) r = \operatorname{Right}(i) largest = i if l \leq A.heap\text{-}size and A[l] > A[largest] largest = l if r \leq A.heap\text{-}size and A[r] > A[largest] largest = r if largest \neq i swap A[i] and A[largest] Max-Heapify(A, largest)
```

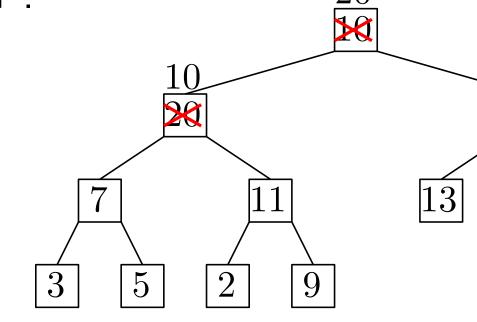
Left(i) return 2i

16

 $\mathsf{Right}(i)$  return 2i+1

## Max-Heapify

Vi lader 10 "boble ned". Max-Heapify(A, 1)



```
Max-Heapify(A, i)
  l = \mathsf{Left}(i)
  r = \mathsf{Right}(i)
  largest = i
  if l \leq A.heap\text{-}size and A[l] > A[largest]
     largest = l
  if r \leq A.heap\text{-}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

16

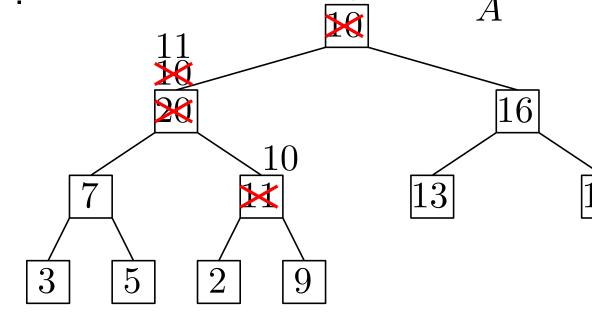
Right(i) return 2i + 1

## Max-Heapify

Vi lader 10 "boble ned".

 $\mathsf{Max} ext{-}\mathsf{Heapify}(A,1)$ 

Max-Heapify(A, i)



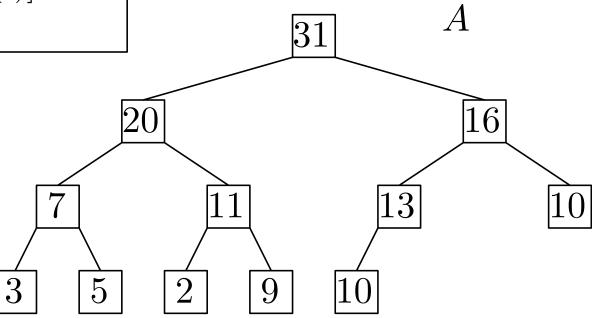
```
l = \mathsf{Left}(i)
r = \mathsf{Right}(i)
largest = i
if \ l \leq A.heap\text{-}size \ \mathsf{and} \ A[l] > A[largest]
largest = l
if \ r \leq A.heap\text{-}size \ \mathsf{and} \ A[r] > A[largest]
largest = r
if \ largest \neq i
\mathsf{swap} \ A[i] \ \mathsf{and} \ A[largest]
\mathsf{Max-Heapify}(A, largest)
```

Left(i) return 2i

 $\mathsf{Right}(i)$  return 2i+1

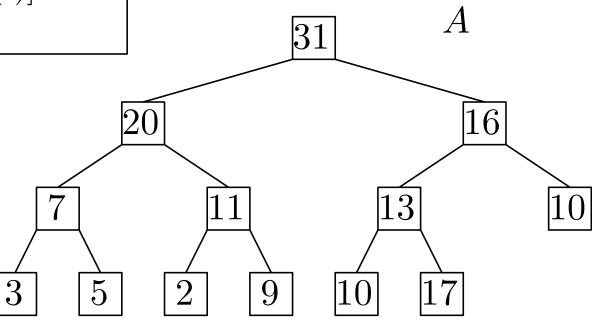
# $\begin{aligned} &\operatorname{Insert}(A,k) \\ &A.heap\text{-}size = A.heap\text{-}size + 1 \\ &i = A.heap\text{-}size \\ &A[i] = k \\ &\text{while } i > 1 \text{ and } A[\operatorname{Parent}(i)] < A[i] \\ &\text{swap } A[i] \text{ and } A[\operatorname{Parent}(i)] \\ &i = \operatorname{Parent}(i) \end{aligned}$

 $\mathsf{Parent}(i)$  return  $\lfloor rac{i}{2} 
floor$ 



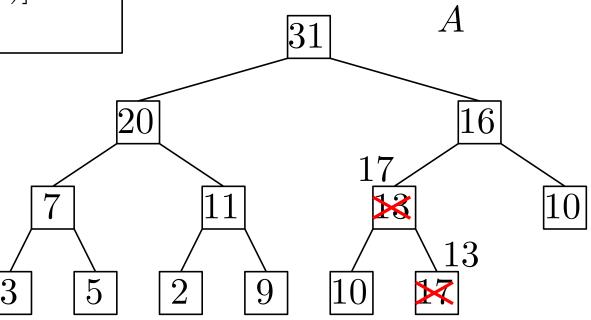
# $\begin{aligned} &\operatorname{Insert}(A,k) \\ &A.heap\text{-}size = A.heap\text{-}size + 1 \\ &i = A.heap\text{-}size \\ &A[i] = k \\ &\text{while } i > 1 \text{ and } A[\operatorname{Parent}(i)] < A[i] \\ &\text{swap } A[i] \text{ and } A[\operatorname{Parent}(i)] \\ &i = \operatorname{Parent}(i) \end{aligned}$

 $\begin{array}{c} \mathsf{Parent}(i) \\ \mathsf{return} \, \left\lfloor \frac{i}{2} \right\rfloor \end{array}$ 



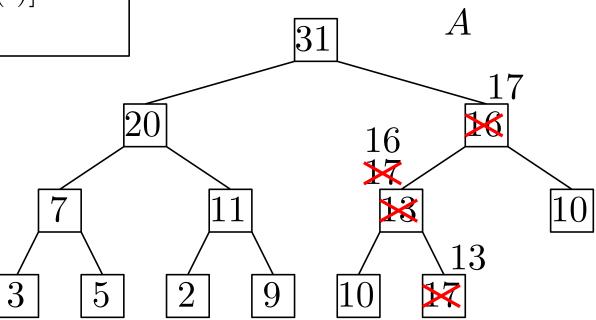
# $\begin{aligned} &\operatorname{Insert}(A,k) \\ &A.heap\text{-}size = A.heap\text{-}size + 1 \\ &i = A.heap\text{-}size \\ &A[i] = k \\ &\text{while } i > 1 \text{ and } A[\operatorname{Parent}(i)] < A[i] \\ &\text{swap } A[i] \text{ and } A[\operatorname{Parent}(i)] \\ &i = \operatorname{Parent}(i) \end{aligned}$

 $\mathsf{Parent}(i)$  return  $\lfloor rac{i}{2} 
floor$ 

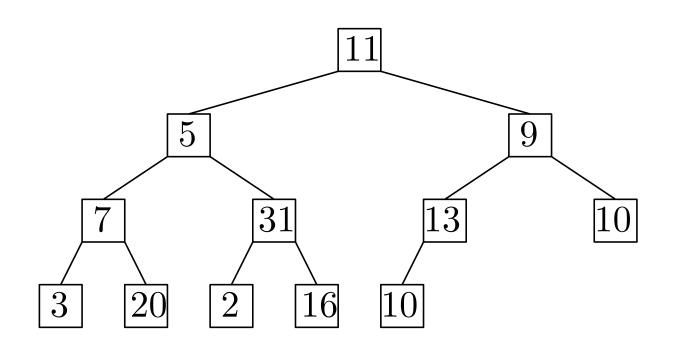


# $\begin{aligned} &\operatorname{Insert}(A,k) \\ &A.heap\text{-}size = A.heap\text{-}size + 1 \\ &i = A.heap\text{-}size \\ &A[i] = k \\ &\text{while } i > 1 \text{ and } A[\operatorname{Parent}(i)] < A[i] \\ &\text{swap } A[i] \text{ and } A[\operatorname{Parent}(i)] \\ &i = \operatorname{Parent}(i) \end{aligned}$

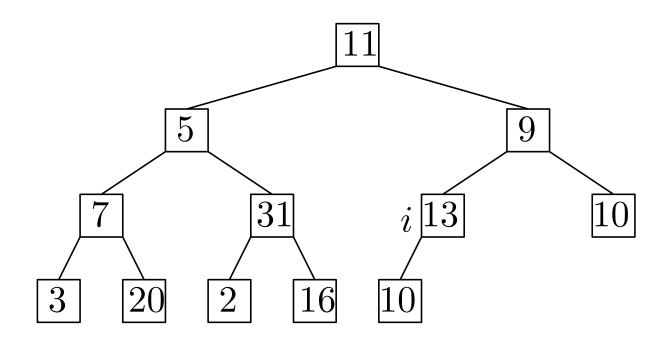
 $\mathsf{Parent}(i)$  return  $\lfloor rac{i}{2} 
floor$ 



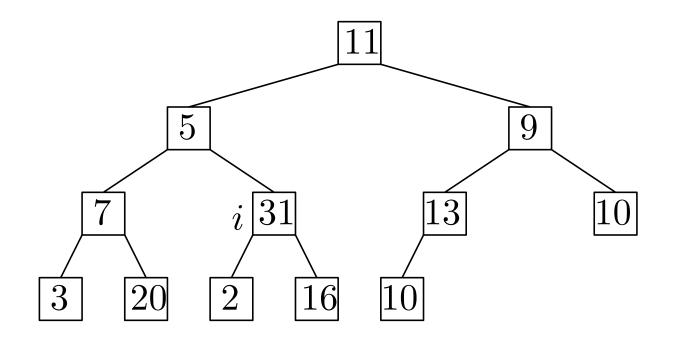
 $\begin{array}{l} \text{Build-Max-Heap}(A) \\ A.heap\text{-}size = A.length \\ \text{for } i = \lfloor \frac{A.length}{2} \rfloor \text{ downto } 1 \\ \text{Max-Heapify}(A,i) \text{ } / / \text{ Lad } A[i] \text{ boble ned} \end{array}$ 



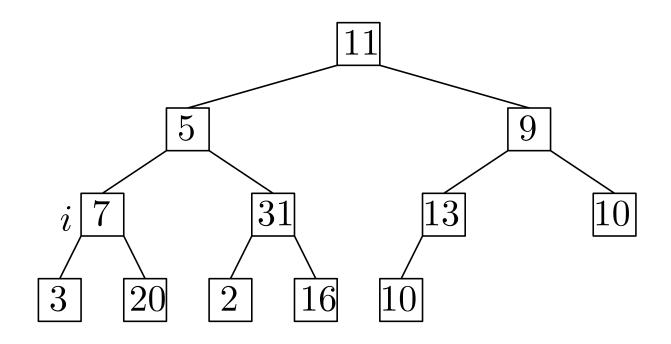
```
\begin{array}{l} \mathsf{Build-Max-Heap}(A) \\ A.heap\text{-}size = A.length = A.length - \lceil \frac{A.length}{2} \rceil \\ \mathsf{for}\ i = \left \lfloor \frac{A.length}{2} \right \rfloor \ \mathsf{downto}\ 1 \\ \mathsf{Max-Heapify}(A,i)\ //\ \mathsf{Lad}\ A[i]\ \mathsf{boble}\ \mathsf{ned} \end{array}
```



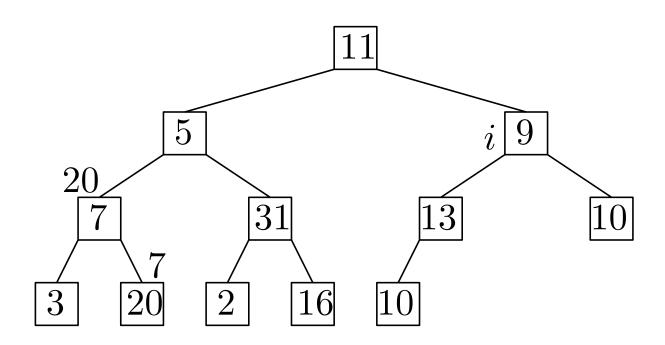
```
\begin{array}{l} \text{Build-Max-Heap}(A) \\ A.heap\text{-}size = A.length \underbrace{ = A.length - \lceil \frac{A.length}{2} \rceil}_{\text{Sidste knude med et barn}} \\ \text{for } i = \underbrace{ \lceil \frac{A.length}{2} \rceil}_{\text{Max-Heapify}} \text{downto } 1 \\ \text{Max-Heapify}(A,i) \text{// Lad } A[i] \text{ boble ned} \end{array}
```



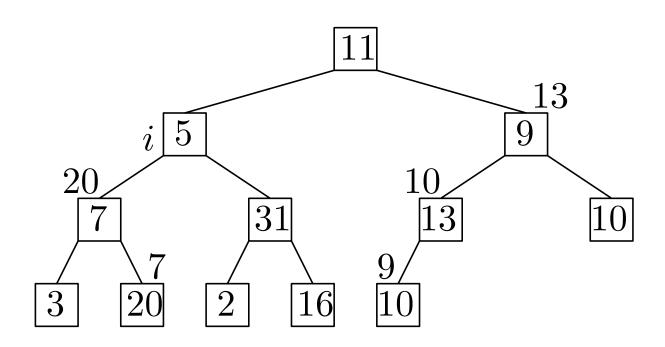
```
\begin{array}{l} \text{Build-Max-Heap}(A) \\ A.heap\text{-}size = A.length - \lceil \frac{A.length}{2} \rceil \\ \text{for } i = \left \lfloor \frac{A.length}{2} \right \rfloor \text{ downto } 1 \\ \text{Max-Heapify}(A,i) \text{ // Lad } A[i] \text{ boble ned} \end{array}
```

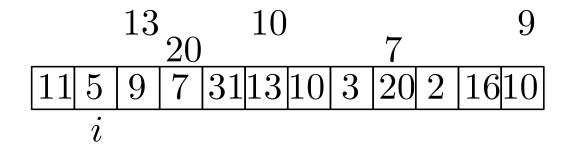


```
\begin{array}{l} \text{Build-Max-Heap}(A) \\ A.heap\text{-}size = A.length \quad = A.length - \lceil \frac{A.length}{2} \rceil \\ \text{for } i = \left \lfloor \frac{A.length}{2} \right \rfloor \text{ downto } 1 \\ \text{Max-Heapify}(A,i) \text{ // Lad } A[i] \text{ boble ned} \end{array}
```

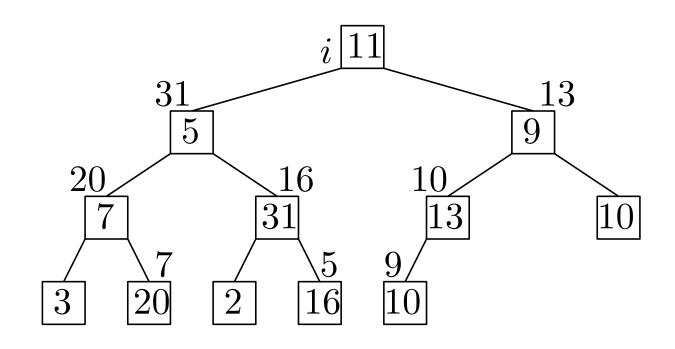


```
\begin{array}{l} \text{Build-Max-Heap}(A) \\ A.heap\text{-}size = A.length - \lceil \frac{A.length}{2} \rceil \\ \text{for } i = \left \lfloor \frac{A.length}{2} \right \rfloor \text{ downto } 1 \\ \text{Max-Heapify}(A,i) \text{ // Lad } A[i] \text{ boble ned} \end{array}
```

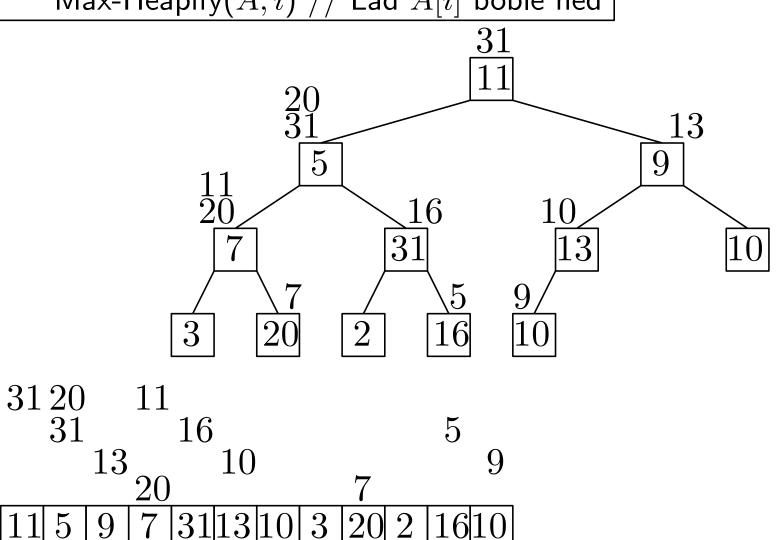




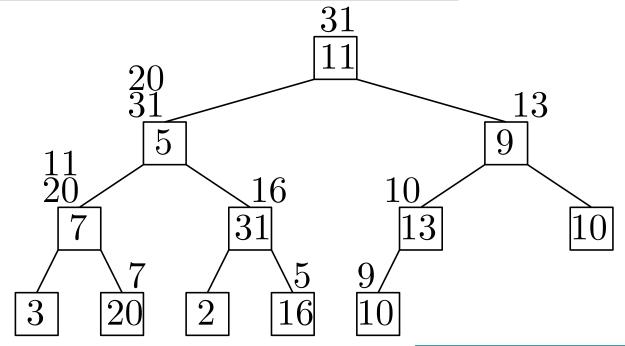
```
\begin{array}{l} \text{Build-Max-Heap}(A) \\ A.heap\text{-}size = A.length \quad = A.length - \lceil \frac{A.length}{2} \rceil \\ \text{for } i = \left \lfloor \frac{A.length}{2} \right \rfloor \text{ downto } 1 \\ \text{Max-Heapify}(A,i) \text{ // Lad } A[i] \text{ boble ned} \end{array}
```

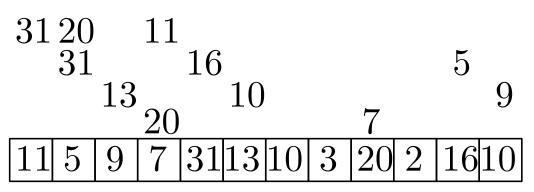


```
\begin{array}{l} \text{Build-Max-Heap}(A) \\ A.heap\text{-}size = A.length \underbrace{ = A.length - \lceil \frac{A.length}{2} \rceil}_{\text{Sidste knude med et barn}} \\ \text{for } i = \underbrace{ \lceil \frac{A.length}{2} \rceil }_{\text{Discontinuous}} \text{downto } 1 \\ \text{Max-Heapify}(A,i) \text{ // Lad } A[i] \text{ boble ned} \end{array}
```



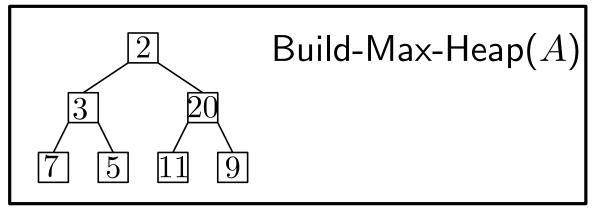
```
\begin{array}{l} \text{Build-Max-Heap}(A) \\ A.heap\text{-}size = A.length \underbrace{ = A.length - \lceil \frac{A.length}{2} \rceil}_{\text{Sidste knude med et barn}} \\ \text{for } i = \underbrace{ \lceil \frac{A.length}{2} \rceil }_{\text{Discontinuous}} \text{downto } 1 \\ \text{Max-Heapify}(A,i) \text{ // Lad } A[i] \text{ boble ned} \end{array}
```

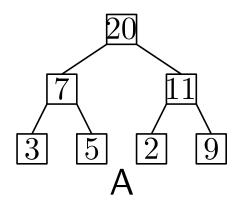


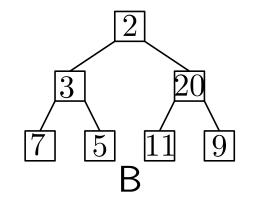


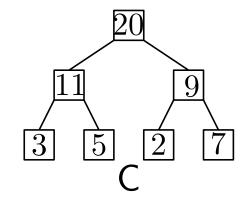
Køretid: Max-Heapify tager  $O(\log n)$  tid. I alt  $O(n\log n)$ . Bedre analyse:  $\Theta(n)$ .

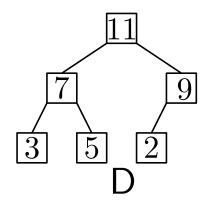
#### Hvordan ser hoben ud til sidst?

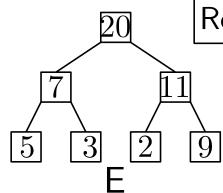




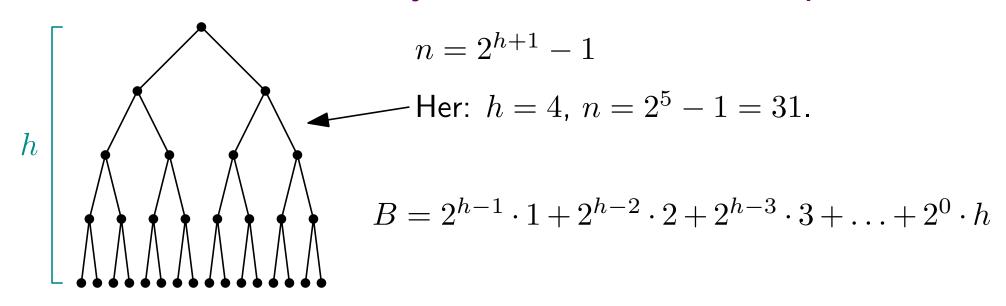


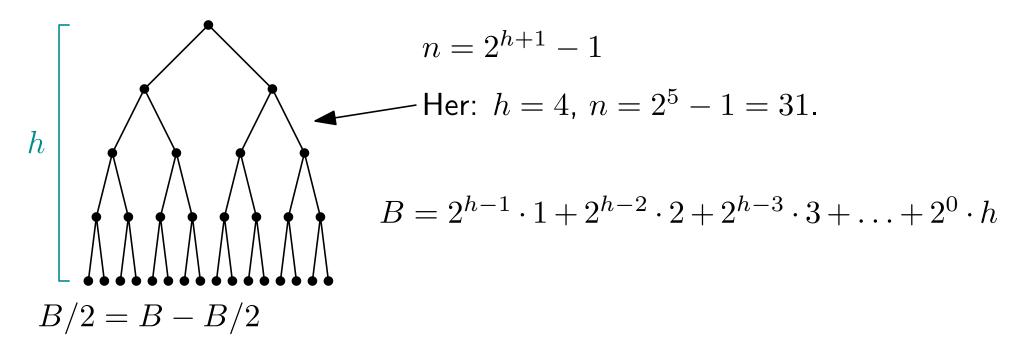


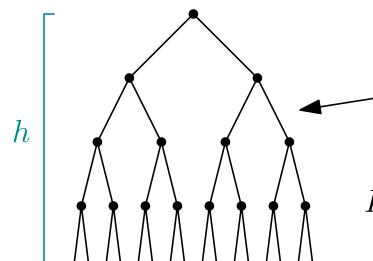




socrative.com  $\rightarrow$  Student login, Room name: ABRAHAMSEN3464







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

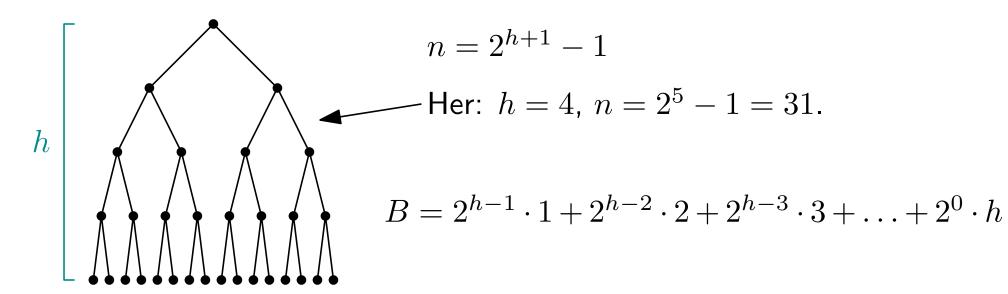
Her: h = 4,  $n = 2^5 - 1 = 31$ .

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

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

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

$$-2^{h-2} \cdot 1 - 2^{h-3} \cdot 2 - \dots - 2^{0} \cdot (h-1) - 2^{-1} \cdot h$$

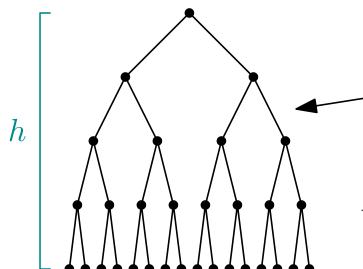


$$B/2 = B - B/2$$

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

$$-2^{h-2} \cdot 1 - 2^{h-3} \cdot 2 - \dots - 2^{0} \cdot (h-1) - 2^{-1} \cdot h$$

$$= 2^{h-1} + 2^{h-2} + \dots + 2^{0} - h/2$$



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

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

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

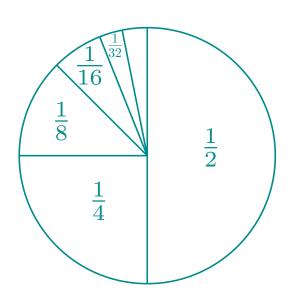
$$B/2 = B - B/2$$

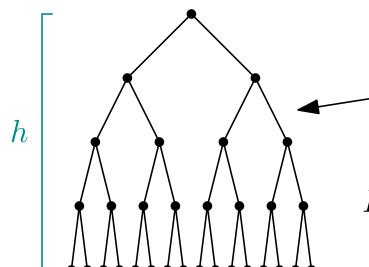
$$= 2^{h-1} \cdot 1 + 2^{h-2} \cdot 2 + 2^{h-3} \cdot 3 + \dots + 2^{0} \cdot h$$

$$-2^{h-2} \cdot 1 - 2^{h-3} \cdot 2 - \dots - 2^{0} \cdot (h-1) - 2^{-1} \cdot h$$

$$= 2^{h-1} + 2^{h-2} + \dots + 2^0 - h/2$$

$$< 2^h - h/2$$





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

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

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

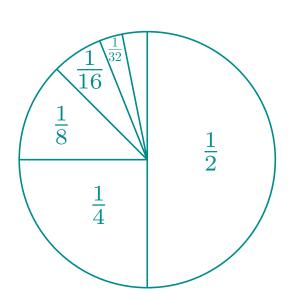
$$B/2 = B - B/2$$

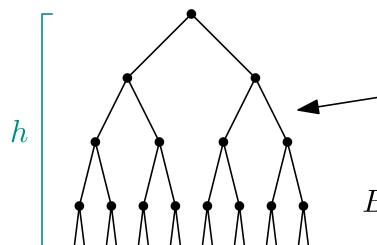
$$= 2^{h-1} \cdot 1 + 2^{h-2} \cdot 2 + 2^{h-3} \cdot 3 + \dots + 2^{0} \cdot h$$

$$-2^{h-2} \cdot 1 - 2^{h-3} \cdot 2 - \dots - 2^{0} \cdot (h-1) - 2^{-1} \cdot h$$

$$= 2^{h-1} + 2^{h-2} + \dots + 2^0 - h/2$$

$$< 2^h - h/2 < 2^h$$





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

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

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

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

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

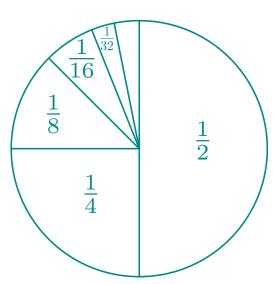
$$-2^{h-2} \cdot 1 - 2^{h-3} \cdot 2 - \dots - 2^{0} \cdot (h-1) - 2^{-1} \cdot h$$

$$= 2^{h-1} + 2^{h-2} + \dots + 2^0 - h/2$$

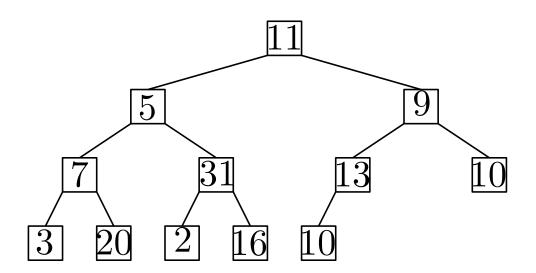
$$< 2^h - h/2 < 2^h$$

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

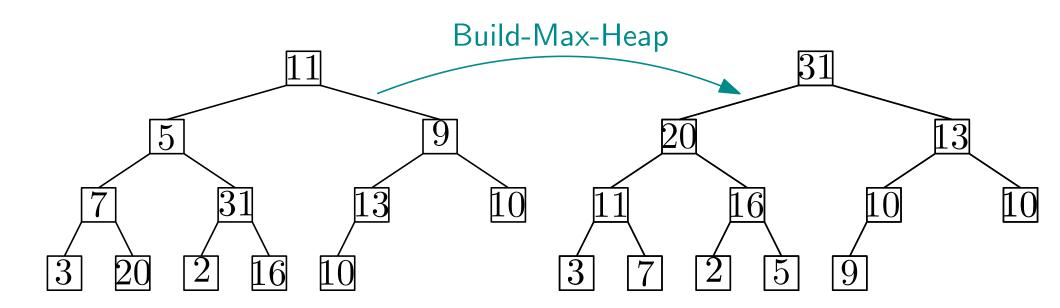
Køretid for Build-Max-Heap:  $\Theta(n)$ .



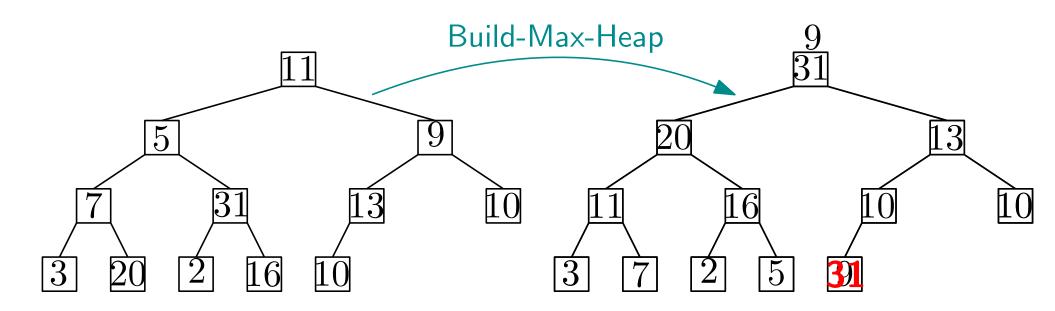
```
\begin{aligned} & \mathsf{Heapsort}(A) \\ & \mathsf{Build-Max-Heap}(A) \\ & \mathsf{for}\ i = A.length\ \mathsf{downto}\ 2 \\ & \mathsf{swap}\ A[1]\ \mathsf{and}\ A[i] \\ & A.heap\text{-}size = A.heap\text{-}size - 1 \\ & \mathsf{Max-Heapify}(A,1) \end{aligned}
```



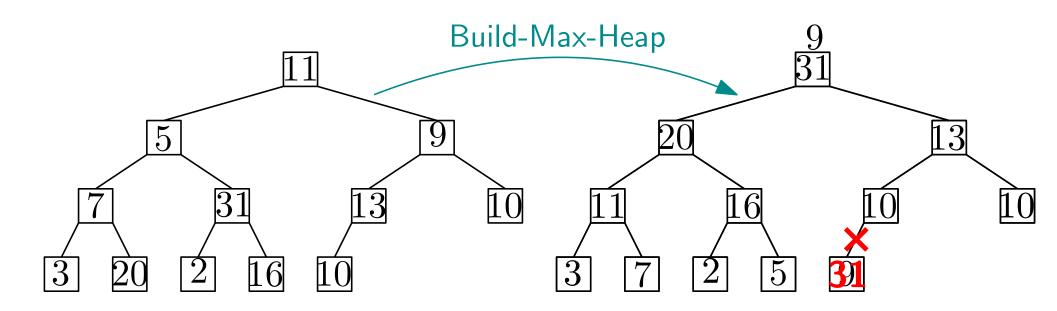
```
\begin{aligned} & \mathsf{Heapsort}(A) \\ & \mathsf{Build-Max-Heap}(A) \\ & \mathsf{for}\ i = A.length\ \mathsf{downto}\ 2 \\ & \mathsf{swap}\ A[1]\ \mathsf{and}\ A[i] \\ & A.heap\text{-}size = A.heap\text{-}size - 1 \\ & \mathsf{Max-Heapify}(A,1) \end{aligned}
```



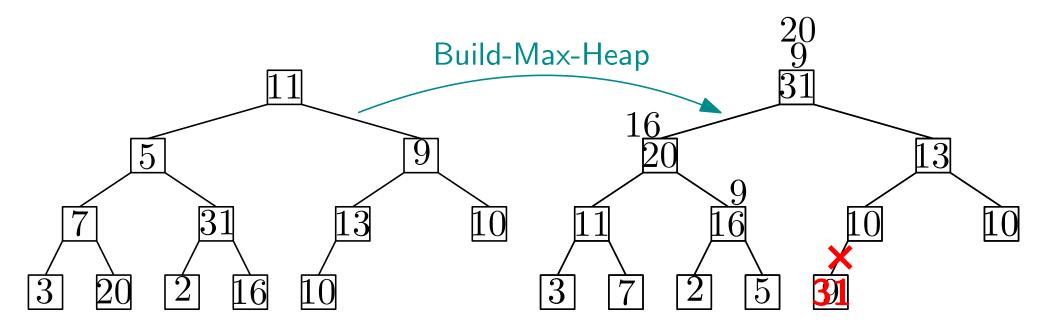
```
\begin{aligned} & \mathsf{Heapsort}(A) \\ & \mathsf{Build-Max-Heap}(A) \\ & \mathsf{for}\ i = A.length\ \mathsf{downto}\ 2 \\ & \mathsf{swap}\ A[1]\ \mathsf{and}\ A[i] \\ & A.heap\text{-}size = A.heap\text{-}size - 1 \\ & \mathsf{Max-Heapify}(A,1) \end{aligned}
```



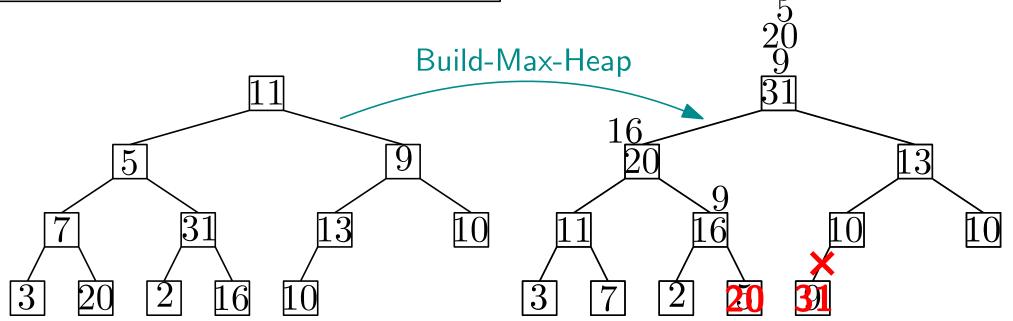
```
\begin{aligned} &\mathsf{Heapsort}(A)\\ &\mathsf{Build-Max-Heap}(A)\\ &\mathsf{for}\ i = A.length\ \mathsf{downto}\ 2\\ &\mathsf{swap}\ A[1]\ \mathsf{and}\ A[i]\\ &A.heap\text{-}size = A.heap\text{-}size - 1\\ &\mathsf{Max-Heapify}(A,1) \end{aligned}
```



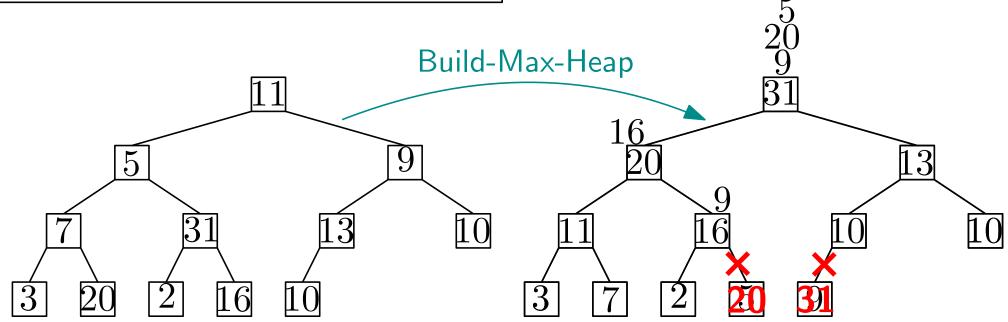
```
\begin{aligned} &\mathsf{Heapsort}(A)\\ &\mathsf{Build-Max-Heap}(A)\\ &\mathsf{for}\ i = A.length\ \mathsf{downto}\ 2\\ &\mathsf{swap}\ A[1]\ \mathsf{and}\ A[i]\\ &A.heap\text{-}size = A.heap\text{-}size - 1\\ &\mathsf{Max-Heapify}(A,1) \end{aligned}
```

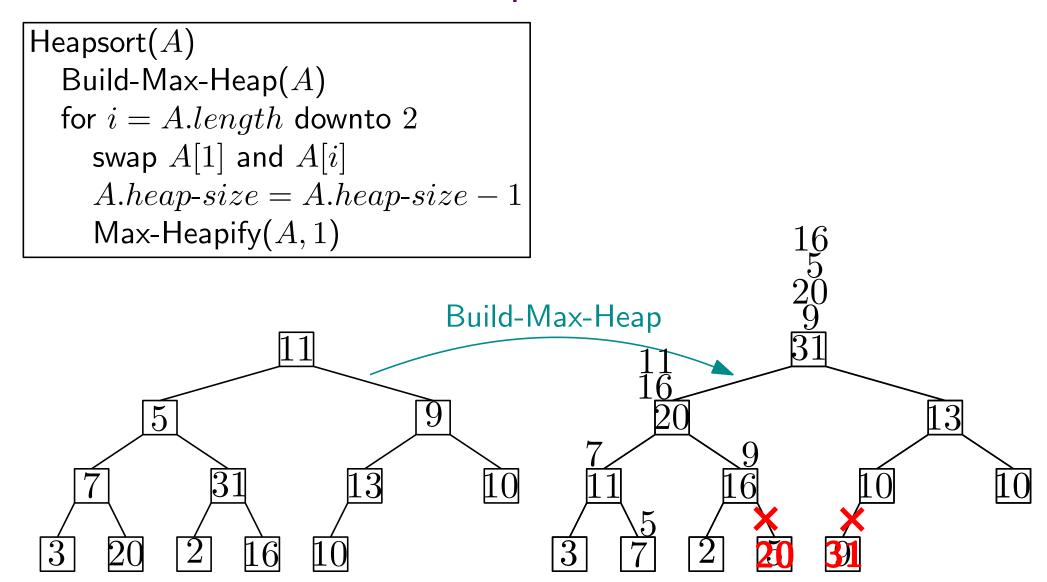


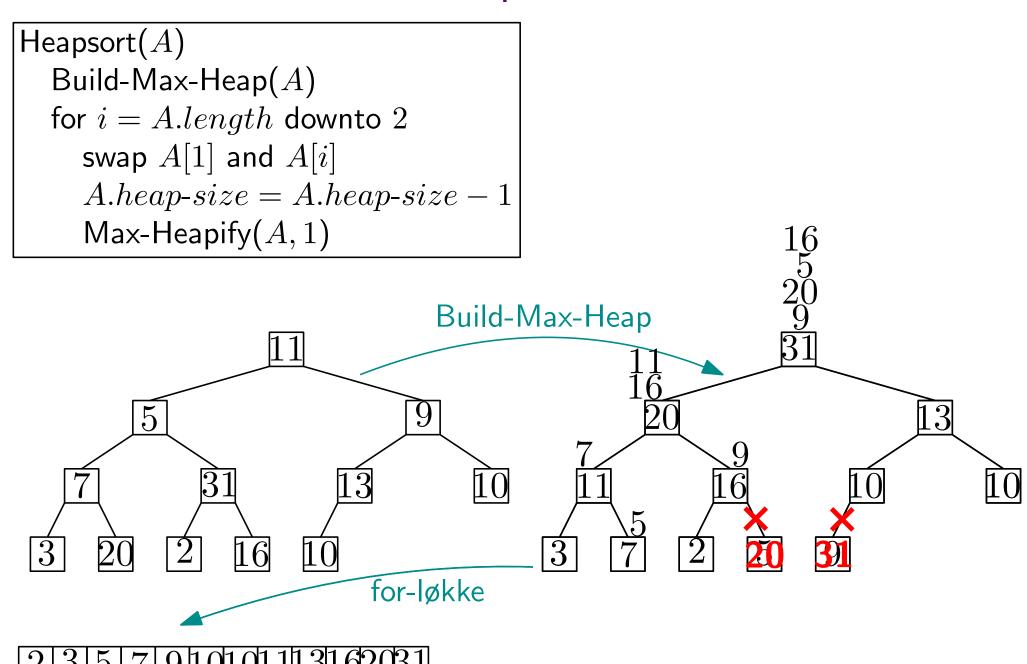
```
\begin{aligned} & \mathsf{Heapsort}(A) \\ & \mathsf{Build-Max-Heap}(A) \\ & \mathsf{for}\ i = A.length\ \mathsf{downto}\ 2 \\ & \mathsf{swap}\ A[1]\ \mathsf{and}\ A[i] \\ & A.heap\text{-}size = A.heap\text{-}size - 1 \\ & \mathsf{Max-Heapify}(A,1) \end{aligned}
```



```
\begin{array}{l} \mathsf{Heapsort}(A) \\ \mathsf{Build-Max-Heap}(A) \\ \mathsf{for} \ i = A.length \ \mathsf{downto} \ 2 \\ \mathsf{swap} \ A[1] \ \mathsf{and} \ A[i] \\ A.heap\text{-}size = A.heap\text{-}size - 1 \\ \mathsf{Max-Heapify}(A,1) \end{array}
```







# Køretid

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

#### Køretid

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

Tid	Gange
$\Theta(n)$	1
$\Theta(1)$	n
$O(\log n)$	n

 $\mathsf{Køretid} \colon T(n) = O(n \cdot 1) + O(1 \cdot n) + O(\log n \cdot n) = O(n \log n).$ 

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

#### Køretid

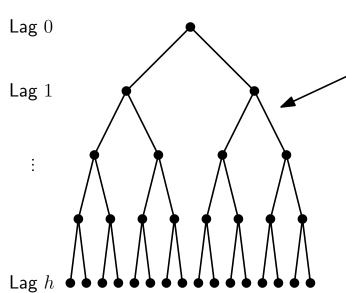
Heapsort(A)		Tid	Gange
Build-Max-Heap $(A)$		$\Theta(n)$	1
for $i = A.length$ downto 2			
swap $A[1]$ and $A[i]$		$\Theta(1)$	$\mid n \mid$
A.heap-size = A.heap-size - 1			
$Max ext{-}Heapify(A,1)$		$O(\log n)$	$\mid n \mid$

 $\mathsf{Køretid} \colon T(n) = O(n \cdot 1) + O(1 \cdot n) + O(\log n \cdot n) = O(n \log n).$ 

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

Ekstra plads:  $\Theta(1)$ .

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

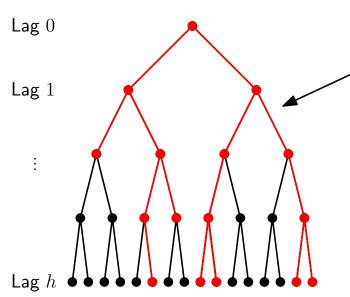


$$n = 2^{h+1} - 1$$

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

Nøgleværdier:  $\{1,2,\ldots,2^{h+1}-1\}$ , én af hver.

Knuder med de  $2^h$  største værdier kaldes *store*, dvs. værdi  $\geq 2^h - 1$ .



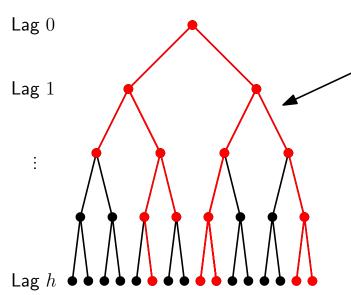
$$n = 2^{h+1} - 1$$

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

Nøgleværdier:  $\{1,2,\ldots,2^{h+1}-1\}$ , én af hver.

Knuder med de  $2^h$  største værdier kaldes *store*, dvs. værdi  $\geq 2^h - 1$ .

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



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

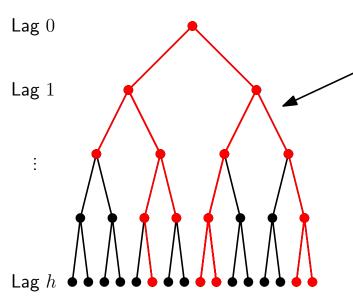
Her: h = 4,  $n = 2^5 - 1 = 31$ .

Nøgleværdier:  $\{1,2,\ldots,2^{h+1}-1\}$ , én af hver.

Knuder med de  $2^h$  største værdier kaldes *store*, dvs. værdi  $\geq 2^h - 1$ .

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

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



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

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

Nøgleværdier:  $\{1,2,\ldots,2^{h+1}-1\}$ , én af hver.

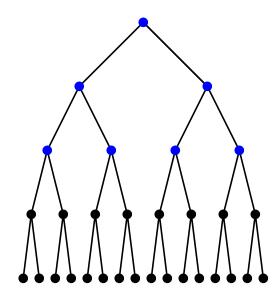
Knuder med de  $2^h$  største værdier kaldes *store*, dvs. værdi  $\geq 2^h - 1$ .

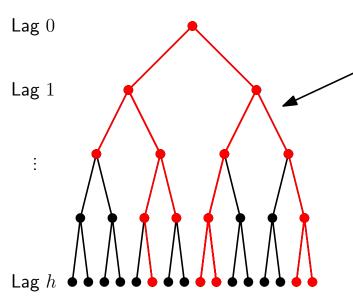
**Observation 1:** Efter Build-Max-Heap danner de store knuder et (sammenhængende) træ.

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

**Observation 3:** Knuder i lag  $1, \ldots, h-2$ :

$$1+2+\ldots+2^{h-2}<2^{h-1}$$
.





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

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

Nøgleværdier:  $\{1,2,\ldots,2^{h+1}-1\}$ , én af hver.

Knuder med de  $2^h$  største værdier kaldes *store*, dvs. værdi  $\geq 2^h - 1$ .

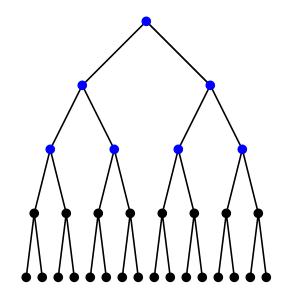
**Observation 1:** Efter Build-Max-Heap danner de store knuder et (sammenhængende) træ.

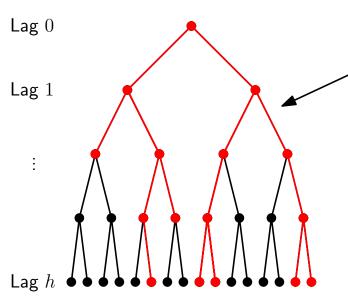
**Observation 2:** Enhver stor knude der starter i lag h-1, bevæger sig til roden og bliver fjernet i løbet af  $2^h$  Extract-Max. Dvs.  $\Omega(\log n)$  skridt op.

**Observation 3:** Knuder i lag  $1, \ldots, h-2$ :

$$1 + 2 + \ldots + 2^{h-2} < 2^{h-1}.$$

**Observation 4:** Mindst  $2^{h-1}$  store knuder i lag h-1,h.





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

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

Nøgleværdier:  $\{1, 2, \dots, 2^{h+1} - 1\}$ , én af hver.

Knuder med de  $2^h$  største værdier kaldes *store*, dvs. værdi  $\geq 2^h - 1$ .

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

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

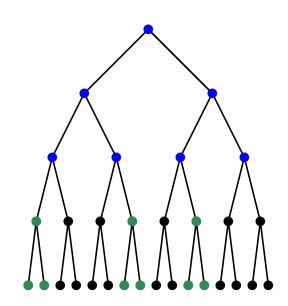
**Observation 3:** Knuder i lag  $1, \ldots, h-2$ :

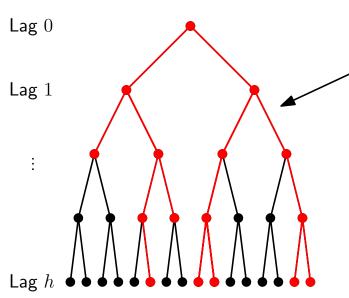
$$1+2+\ldots+2^{h-2}<2^{h-1}$$
.

**Observation 4:** Mindst  $2^{h-1}$  store knuder i lag h-1,h.

**Observation 5:** x knuder i lag  $h-1 \Rightarrow h$ øjst 3x knuder i lag h-1,h. Derfor

$$3x \ge 2^{h-1} \Rightarrow x \ge \frac{2^{h-1}}{3} = \frac{2^{h+1}}{12} = \frac{n+1}{12} = \Omega(n).$$





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

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

Nøgleværdier:  $\{1, 2, \dots, 2^{h+1} - 1\}$ , én af hver.

Knuder med de  $2^h$  største værdier kaldes *store*, dvs. værdi  $\geq 2^h - 1$ .

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

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

**Observation 3:** Knuder i lag  $1, \ldots, h-2$ :

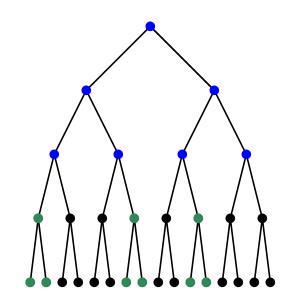
$$1+2+\ldots+2^{h-2}<2^{h-1}$$
.

**Observation 4:** Mindst  $2^{h-1}$  store knuder i lag h-1,h.

**Observation 5:** x knuder i lag  $h-1 \Rightarrow h$ øjst 3x knuder i lag h-1,h. Derfor

$$3x \ge 2^{h-1} \Rightarrow x \ge \frac{2^{h-1}}{3} = \frac{2^{h+1}}{12} = \frac{n+1}{12} = \Omega(n).$$

**Konklusion:** Observation 2+5 giver  $\Omega(n \log n)$  tid.



## Hvor meget forstod du af beviset?

socrative.com  $\rightarrow$  Student login,

Room name: ABRAHAMSEN3464

Det hele.

Α

Det meste.

В

Noget.

Kun en lille smule.

Ingenting.