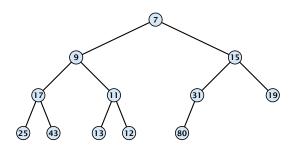
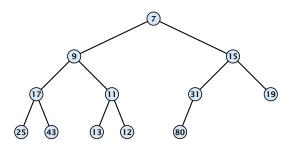


Nearly complete binary tree; only the last level is not full, and this one is filled from left to right.





- Nearly complete binary tree; only the last level is not full, and this one is filled from left to right.
- Heap property: A node's key is not larger than the key of one of its children.





- **minimum():** return the root-element. Time  $\mathcal{O}(1)$ .
- ▶ **is-empty():** check whether root-pointer is null. Time  $\mathcal{O}(1)$ .



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#### Maintain a pointer to the last element x.

We can compute the predecessor of x (last element when x is deleted) in time  $\mathcal{O}(\log n)$ .

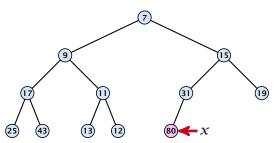
9 (1) (3) (1) (19)





Maintain a pointer to the last element x.

- ▶ We can compute the predecessor of x (last element when x is deleted) in time  $O(\log n)$ .
  - go up until the last edge used was a right edge. go left; go right until you reach a leaf
  - if you hit the root on the way up, go to the rightmost element

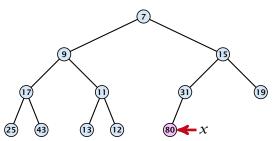




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if you hit the root on the way up, go to the rightmost element



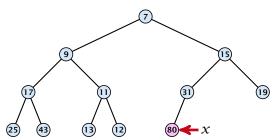


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if you hit the root on the way up, go to the rightmost element





### Maintain a pointer to the last element x.

We can compute the successor of x (last element when an element is inserted) in time  $O(\log n)$ 

9 11 31 13 12 80 7

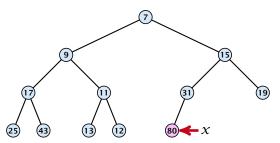


Maintain a pointer to the last element x.

• We can compute the successor of x (last element when an element is inserted) in time  $\mathcal{O}(\log n)$ .

go up until the last edge used was a left edge. go right; go left until you reach a null-pointer.

if you hit the root on the way up, go to the leftmost element; insert a new element as a left child;

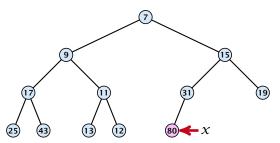




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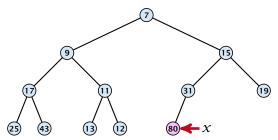


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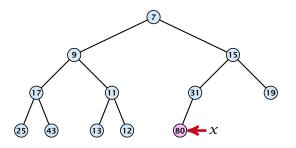
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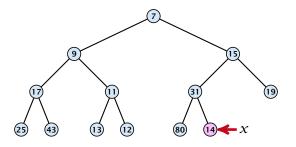
#### 1. Insert element at successor of x.

2. Exchange with parent until heap property is fulfilled.



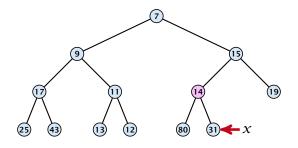


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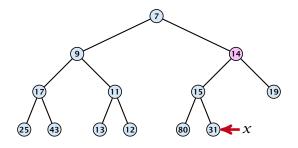


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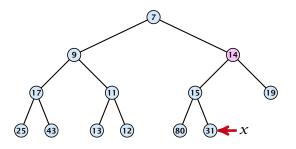


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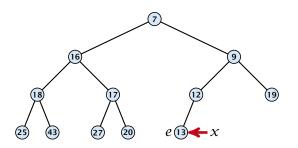


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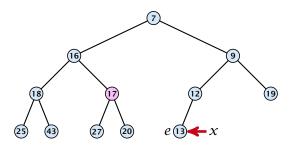


- 1. Exchange the element to be deleted with the element *e* pointed to by *x*.
- 2. Restore the heap-property for the element e.



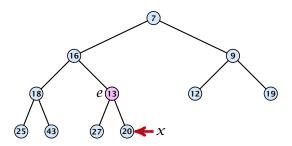


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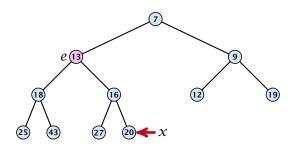
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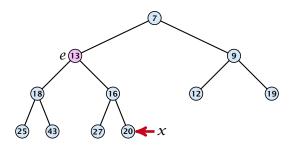


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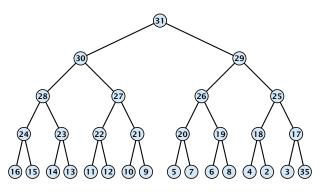






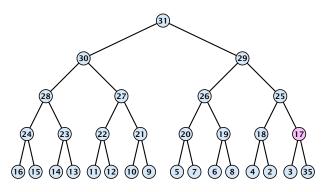
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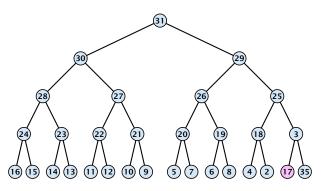
$$\sum_{\text{levels } \ell} 2^{\ell} \cdot (h - \ell) = \mathcal{O}(2^h) = \mathcal{O}(n)$$





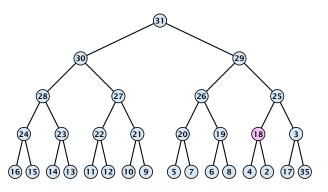
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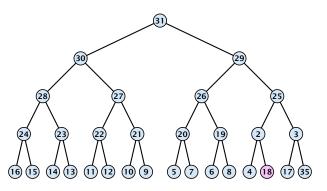




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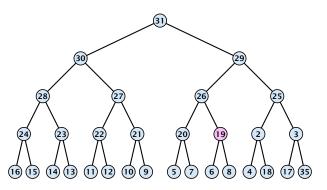


We can build a heap in linear time:



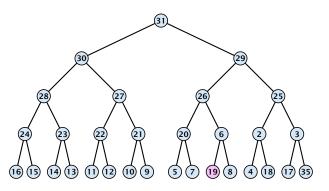
 $\sum_{\text{levels } \ell} 2^{\ell} \cdot (h - \ell) = \mathcal{O}(2^h) = \mathcal{O}(n)$ 





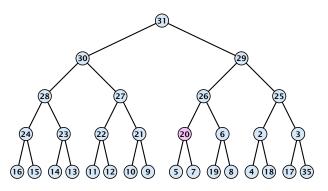
$$\sum_{\text{levels }\ell} 2^{\ell} \cdot (h - \ell) = \mathcal{O}(2^h) = \mathcal{O}(n)$$





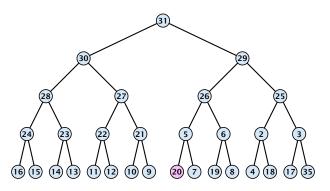
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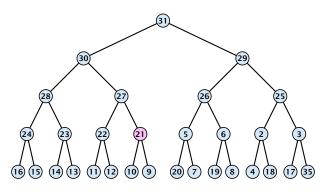
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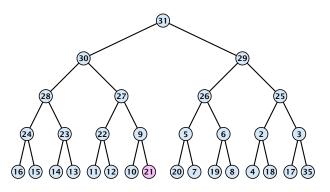
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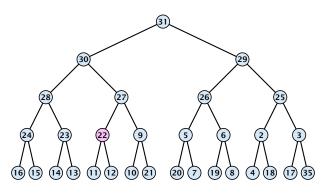
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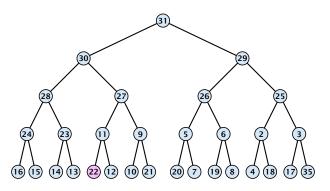
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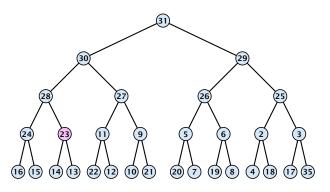
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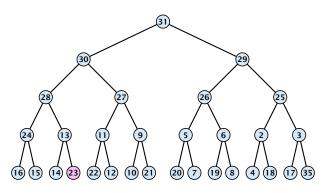
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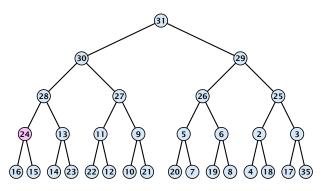
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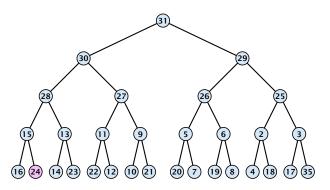




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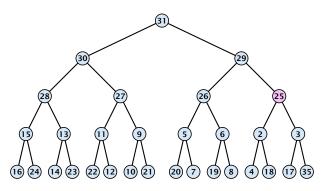


We can build a heap in linear time:



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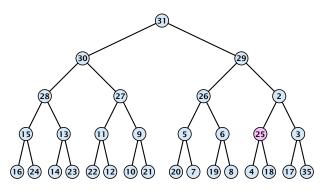




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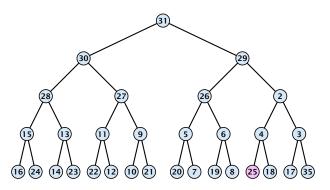
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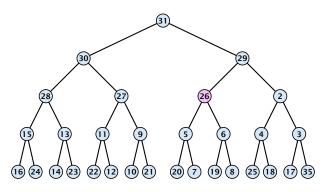


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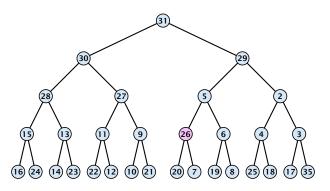




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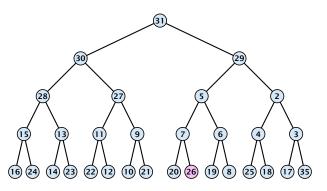


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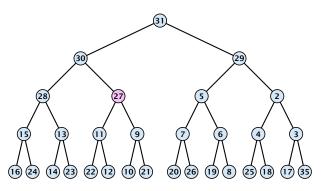
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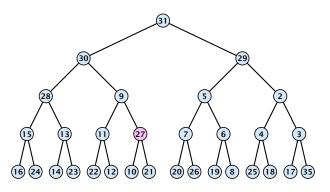
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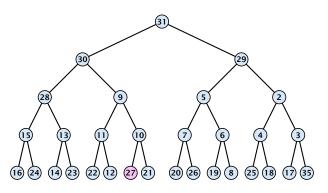
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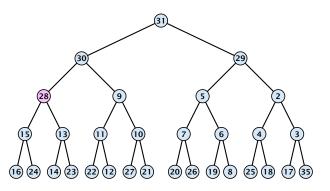
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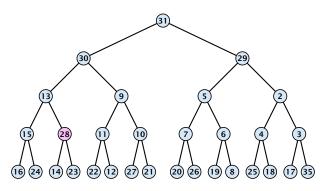
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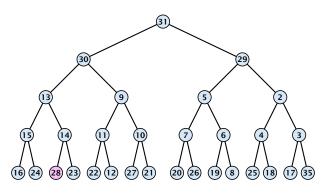
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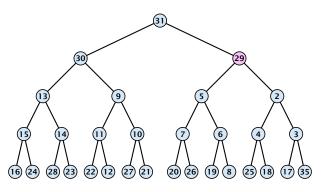
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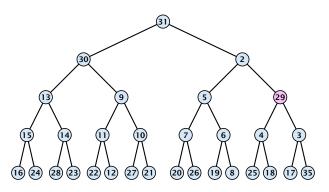
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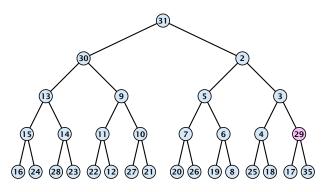
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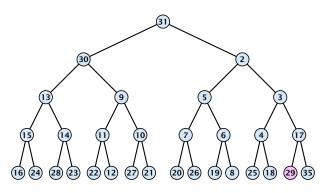
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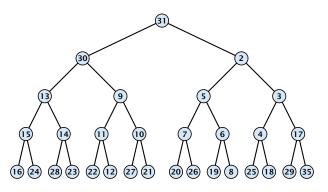
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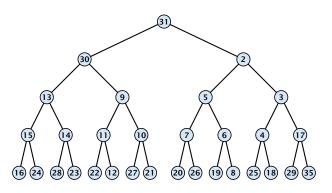
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#### **Operations:**

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- ▶ **insert**(k): Insert at x and bubble up. Time  $O(\log n)$ .
- delete(h): Swap with x and bubble up or sift-down. Time  $\mathcal{O}(\log n)$ .
- **build** $(x_1, \ldots, x_n)$ : Insert elements arbitrarily; then do sift-down operations starting with the lowest layer in the tree. Time  $\mathcal{O}(n)$ .



The standard implementation of binary heaps is via arrays. Let A[0,...,n-1] be an array

- ▶ The parent of *i*-th element is at position  $\lfloor \frac{i-1}{2} \rfloor$ .
- ▶ The left child of i-th element is at position 2i + 1.
- ▶ The right child of *i*-th element is at position 2i + 2i

Finding the successor of x is much easier than in the description on the previous slide. Simply increase or decrease x.



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