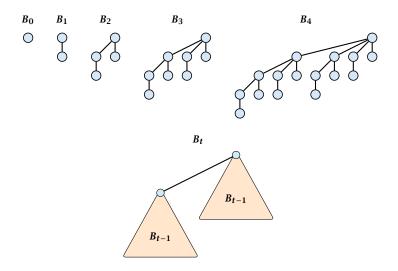
| Operation    | Binary<br>Heap | BST        | Binomial<br>Heap | Fibonacci<br>Heap* |
|--------------|----------------|------------|------------------|--------------------|
| build        | n              | $n \log n$ | $n \log n$       | n                  |
| minimum      | 1              | $\log n$   | $\log n$         | 1                  |
| is-empty     | 1              | 1          | 1                | 1                  |
| insert       | $\log n$       | $\log n$   | $\log n$         | 1                  |
| delete       | $\log n^{**}$  | $\log n$   | $\log n$         | $\log n$           |
| delete-min   | $\log n$       | $\log n$   | $\log n$         | $\log n$           |
| decrease-key | $\log n$       | $\log n$   | $\log n$         | 1                  |
| merge        | n              | $n \log n$ | $\log n$         | 1                  |



### **Properties of Binomial Trees**

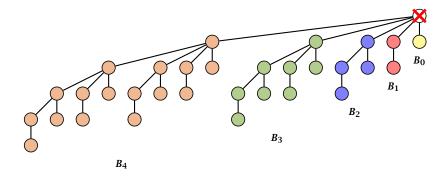
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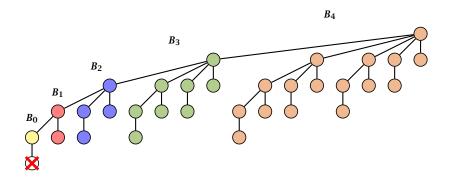
- $ightharpoonup B_k$  has  $2^k$  nodes.
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- ▶ The root of  $B_k$  has degree k.

- $\triangleright$   $B_k$  has  $2^k$  nodes.
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- $ightharpoonup B_k$  has  $\binom{k}{\ell}$  nodes on level  $\ell$ .

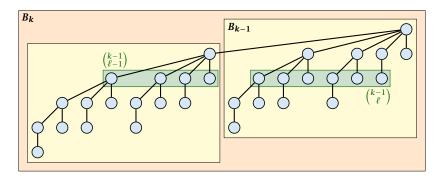
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- ▶ The root of  $B_k$  has degree k.
- ▶  $B_k$  has  $\binom{k}{\ell}$  nodes on level  $\ell$ .
- ▶ Deleting the root of  $B_k$  gives trees  $B_0, B_1, ..., B_{k-1}$ .



Deleting the root of  $B_5$  leaves sub-trees  $B_4$ ,  $B_3$ ,  $B_2$ ,  $B_1$ , and  $B_0$ .

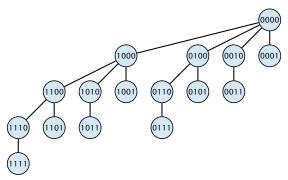


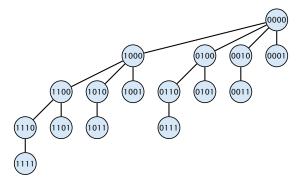
Deleting the leaf furthest from the root (in  $B_5$ ) leaves a path that connects the roots of sub-trees  $B_4$ ,  $B_3$ ,  $B_2$ ,  $B_1$ , and  $B_0$ .



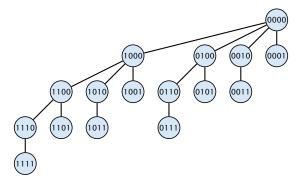
The number of nodes on level  $\ell$  in tree  $B_k$  is therefore

$$\begin{pmatrix} k-1\\ \ell-1 \end{pmatrix} + \begin{pmatrix} k-1\\ \ell \end{pmatrix} = \begin{pmatrix} k\\ \ell \end{pmatrix}$$



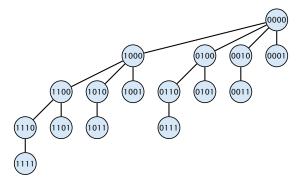


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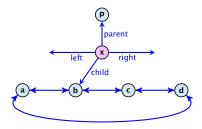
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The parent of a node with label  $b_k, \ldots, b_1$  is obtained by setting the least significant 1-bit to 0.

The  $\ell$ -th level contains nodes that have  $\ell$  1's in their label.

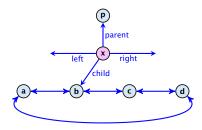
### How do we implement trees with non-constant degree?

▶ The children of a node are arranged in a circular linked list.



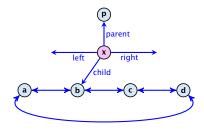
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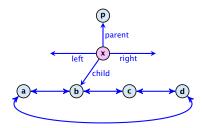
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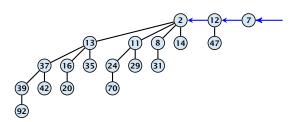


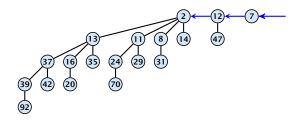
#### How do we implement trees with non-constant degree?

- The children of a node are arranged in a circular linked list.
- A child-pointer points to an arbitrary node within the list.
- A parent-pointer points to the parent node.
- Pointers x. left and x. right point to the left and right sibling of x (if x does not have siblings then x. left = x. right = x).

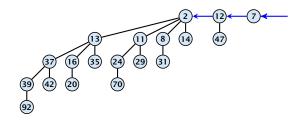


- Given a pointer to a node x we can splice out the sub-tree rooted at x in constant time.
- We can add a child-tree T to a node x in constant time if we are given a pointer to x and a pointer to the root of T.



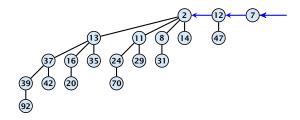


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There is at most one tree for every dimension/order. For example the above heap contains trees  $B_0$ ,  $B_1$ , and  $B_4$ .

Given the number n of keys to be stored in a binomial heap we can deduce the binomial trees that will be contained in the collection.

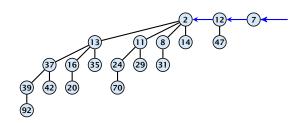
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Let  $B_{k_1}$ ,  $B_{k_2}$ ,  $B_{k_3}$ ,  $k_i < k_{i+1}$  denote the binomial trees in the collection and recall that every tree may be contained at most once.

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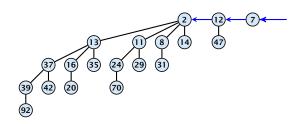
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Then  $n=\sum_i 2^{k_i}$  must hold. But since the  $k_i$  are all distinct this means that the  $k_i$  define the non-zero bit-positions in the binary representation of n.

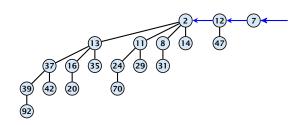


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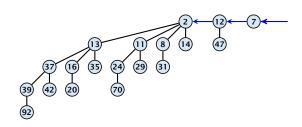
Let  $n = b_d b_{d-1}, \dots, b_0$  denote binary representation of n.



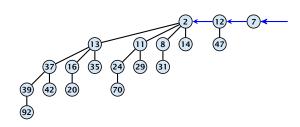
- Let  $n = b_d b_{d-1}, \dots, b_0$  denote binary representation of n.
- ▶ The heap contains tree  $B_i$  iff  $b_i = 1$ .



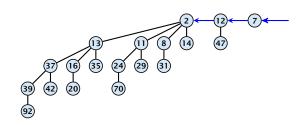
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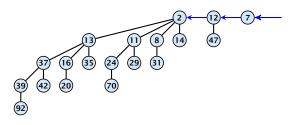
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- The trees are stored in a single-linked list; ordered by dimension/size.



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Otherwise, we cannot do this because the merged heap is not allowed to contain two trees of the same order.

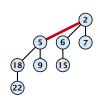
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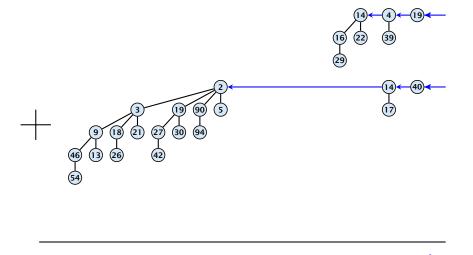
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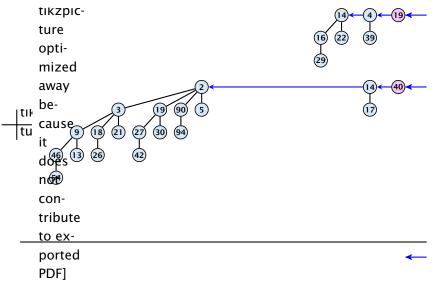
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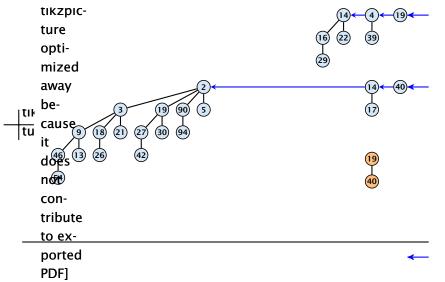
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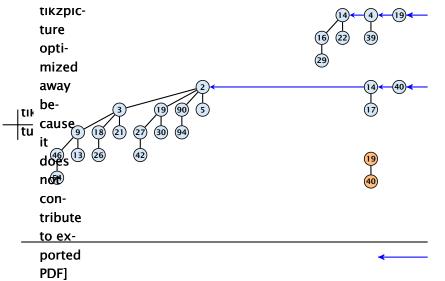
For more trees the technique is analogous to binary addition.

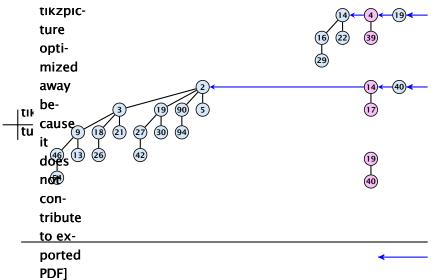


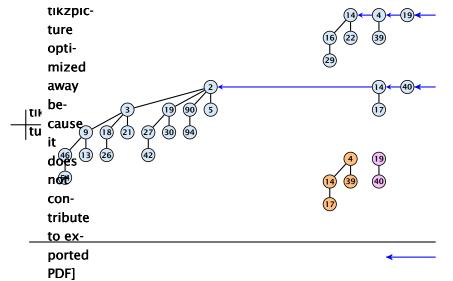


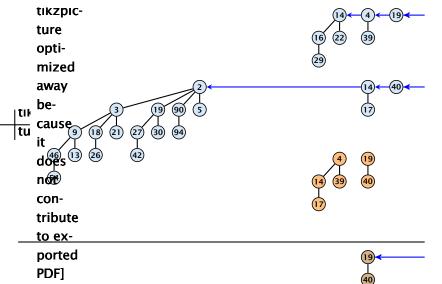


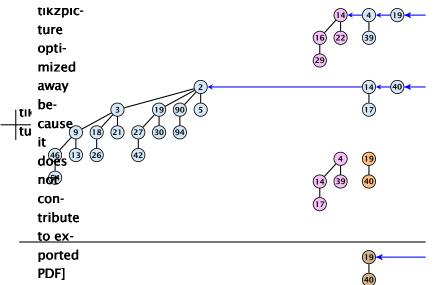


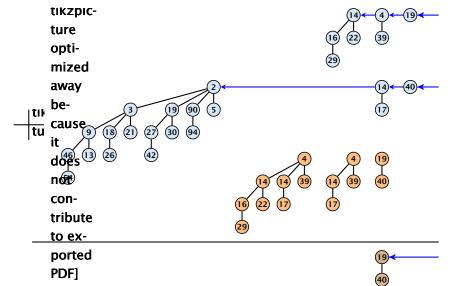


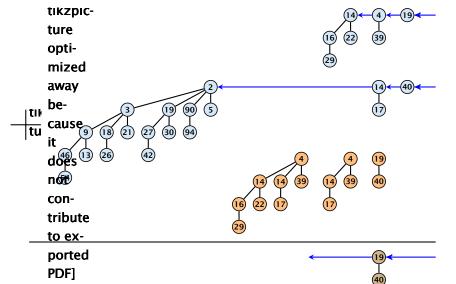


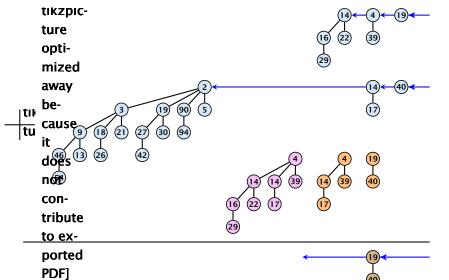


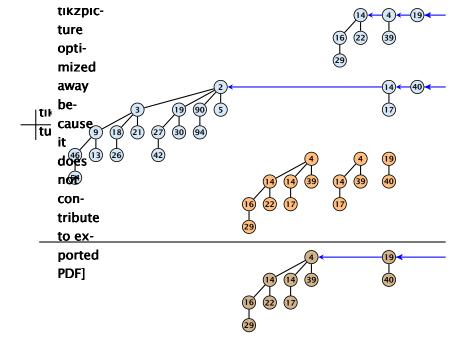


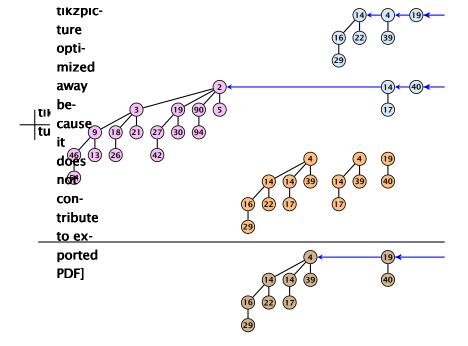


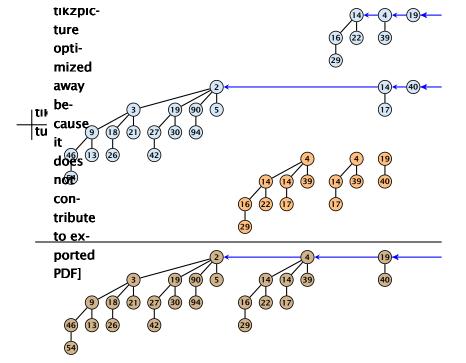


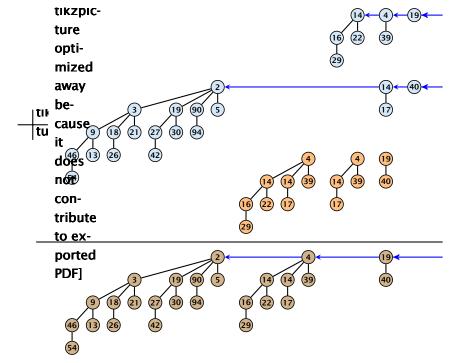












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