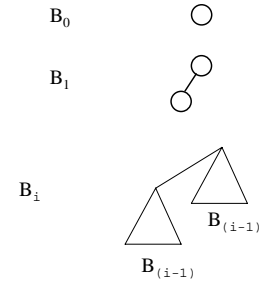


# Binomial heaps, Fibonacci heaps, and applications

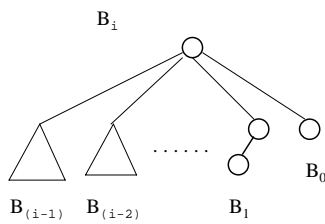
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## Binomial trees



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## Binomial trees



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## Properties of binomial trees

- 1)  $|B_k| = 2^k$
- 2)  $\text{degree}(\text{root}(B_k)) = k$
- 3)  $\text{depth}(B_k) = k$

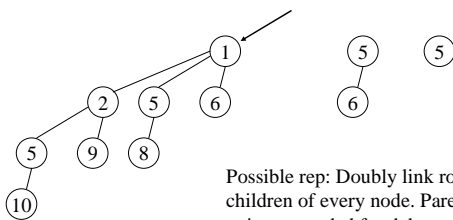
$\implies$  The degree and depth of a binomial tree with at most  $n$  nodes is at most  $\log(n)$ .

Define the rank of  $B_k$  to be  $k$

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## Binomial heaps (def)

A collection of binomial trees at most one of every rank.  
Items at the nodes, heap ordered.



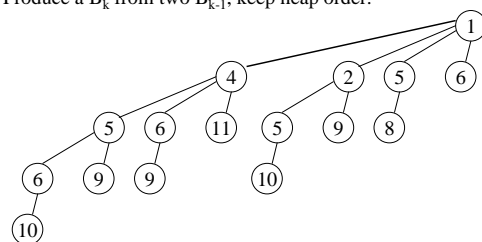
Possible rep: Doubly link roots and children of every node. Parent pointers needed for delete.

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## Binomial heaps (operations)

Operations are defined via a basic operation, called linking, of binomial trees:

Produce a  $B_k$  from two  $B_{k-1}$ , keep heap order.



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## Binomial heaps (ops cont.)

Basic operation is meld(h1,h2):

Like addition of binary numbers.

$$\begin{array}{rcccccc}
 & & B_5 & B_4 & & B_2 & B_1 & & \\
 h1: & & & B_4 & B_3 & & B_1 & B_0 & \\
 h2: & & & B_4 & B_3 & & & B_0 & + \\
 \hline
 & & B_5 & B_4 & & B_2 & & & 
 \end{array}$$

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## Binomial heaps (ops cont.)

Findmin(h): obvious

Insert(x,h) : meld a new heap with a single  $B_0$  containing x, with h

deletemin(h) : Chop off the minimal root. Meld the subtrees with h. Update minimum pointer if needed.

delete(x,h) : Bubble up and continue like delete-min

decrease-key(x,h, $\delta$ ) : Bubble up, update min ptr if needed

All operations take  $O(\log n)$  time on the worst case, except find-min(h) that takes  $O(1)$  time.

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## Amortized analysis

We are interested in the worst case running time of a sequence of operations.

Example: binary counter

single operation -- increment

```

00000
00001
00010
00011
00100
00101
    
```

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## Amortized analysis (Cont.)

On the worst case increment takes  $O(k)$ .

$k = \text{\#digits}$

What is the complexity of a sequence of increments (on the worst case) ?

Define a potential of the counter:

$$\Phi(c) = ?$$

$$\text{Amortized}(\text{increment}) = \text{actual}(\text{increment}) + \Delta\Phi$$

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## Amortized analysis (Cont.)

$$\text{Amortized}(\text{increment}_1) = \text{actual}(\text{increment}_1) + \Phi_1 - \Phi_0$$

$$\text{Amortized}(\text{increment}_2) = \text{actual}(\text{increment}_2) + \Phi_2 - \Phi_1$$

...

...

+

$$\text{Amortized}(\text{increment}_n) = \text{actual}(\text{increment}_n) + \Phi_n - \Phi_{(n-1)}$$

$$\sum_i \text{Amortized}(\text{increment}_i) = \sum_i \text{actual}(\text{increment}_i) + \Phi_n - \Phi_0$$

$$\sum_i \text{Amortized}(\text{increment}_i) \geq \sum_i \text{actual}(\text{increment}_i)$$

if  $\Phi_n - \Phi_0 \geq 0$

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## Amortized analysis (Cont.)

Define a potential of the counter:

$$\Phi(c) = \text{\#(ones)}$$

$$\text{Amortized}(\text{increment}) = \text{actual}(\text{increment}) + \Delta\Phi$$

$$\text{Amortized}(\text{increment}) = 1 + \text{\#}(1 \Rightarrow 0) + 1 - \text{\#}(1 \Rightarrow 0) = O(1)$$

$\Rightarrow$  Sequence of n increments takes  $O(n)$  time

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## Binomial heaps - amortized ana.

$\Phi$  (collection of heaps) = #(trees)

Amortized cost of insert  $O(1)$

Amortized cost of other operations still  $O(\log n)$

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## Binomial heaps + lazy meld

Allow more than one tree of each rank.

Meld ( $h_1, h_2$ ) :

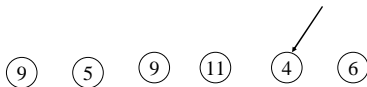
- Concatenate the lists of binomial trees.
- Update the minimum pointer to be the smaller of the minimums

$O(1)$  worst case and amortized.

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## Binomial heaps + lazy meld

As long as we do not do a delete-min our heaps are just doubly linked lists:



Delete-min : Chop off the minimum root, add its children to the list of trees.

Successive linking: Traverse the forest keep linking trees of the same rank, maintain a pointer to the minimum root.

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## Binomial heaps + lazy meld

Possible implementation of delete-min is using an array indexed by rank to keep at most one binomial tree of each rank that we already traversed.

Once we encounter a second tree of some rank we link them and keep linking until we do not have two trees of the same rank. We record the resulting tree in the array

$$\begin{aligned} \text{Amortized}(\text{delete-min}) &= \\ &= (\#links + \text{max-rank}) - \#links \\ &= O(\log(n)) \end{aligned}$$

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## Fibonacci heaps (Fredman & Tarjan 84)

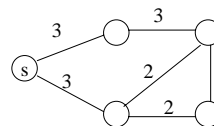
Want to do decrease-key( $x, h, \delta$ ) faster than delete+insert. Ideally in  $O(1)$  time.

Why ?

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## Dijkstra's shortest path algorithm

Let  $G = (V, E)$  be a weighted (weights are non-negative) undirected graph, let  $s \in V$ . Want to find the distance (length of the shortest path),  $d(s, v)$  from  $s$  to every other vertex.



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## Application #2 : Prim's algorithm for MST

Start with T a singleton vertex.

Grow a tree by repeating the following step:

Add the minimum cost edge connecting a vertex in T to a vertex out of T.

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## Application #2 : Prim's algorithm for MST

Maintain the vertices out of T but adjacent to T in a heap.

The key of a vertex  $v$  is the weight of the lightest edge  $(v,w)$  where  $w$  is in the tree.

Iteration: Do a delete-min. Let  $v$  be the minimum vertex and  $(v,w)$  the lightest edge as above. Add  $(v,w)$  to T. For each edge  $(w,u)$  where  $u \notin T$ ,

if  $\text{key}(u) = \infty$  insert  $u$  into the heap with  $\text{key}(u) = w(w,u)$   
 if  $w(w,u) < \text{key}(u)$  decrease the key of  $u$  to be  $w(w,u)$ .

With regular heaps  $O(m \log(n))$ .

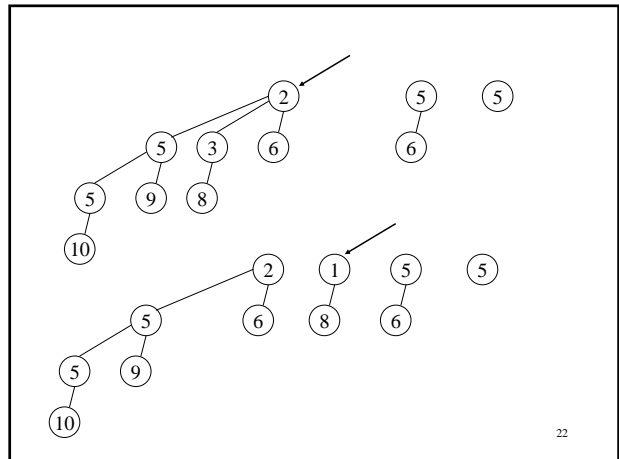
With F-heaps  $O(n \log(n) + m)$ .

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Suggested implementation for decrease-key( $x,h,\delta$ ):

If  $x$  with its new key is smaller than its parent, cut the subtree rooted at  $x$  and add it to the forest. Update the minimum pointer if necessary.

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## Decrease-key (cont.)

Does it work ?

Obs1: Trees need not be binomial trees any more..

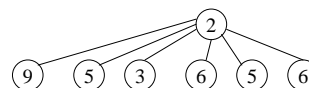
Do we need the trees to be binomial ?

Where have we used it ?

In the analysis of delete-min we used the fact that at most  $\log(n)$  new trees are added to the forest. This was obvious since trees were binomial and contained at most  $n$  nodes.

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## Decrease-key (cont.)



Such trees are now legitimate.

So our analysis breaks down.

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### Fibonacci heaps (cont.)

We shall allow non-binomial trees, but will keep the degrees logarithmic in the number of nodes.

Rank of a tree = degree of the root.

Delete-min: do successive linking of trees of the same rank and update the minimum pointer as before.

Insert and meld also work as before.

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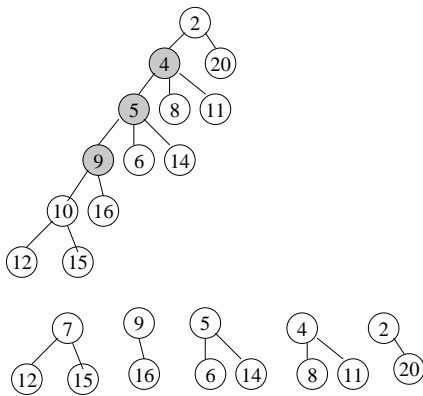
### Fibonacci heaps (cont.)

Decrease-key ( $x, h, \delta$ ): indeed cuts the subtree rooted by  $x$  if necessary as we showed.

in addition we maintain a mark bit for every node. When we cut the subtree rooted by  $x$  we check the mark bit of  $p(x)$ . If it is set then we cut  $p(x)$  too. We continue this way until either we reach an unmarked node in which case we mark it, or we reach the root.

This mechanism is called cascading cuts.

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### Fibonacci heaps (delete)

Delete( $x, h$ ): Cut the subtree rooted at  $x$  and then proceed with cascading cuts as for decrease key.

Chop off  $x$  from being the root of its subtree and add the subtrees rooted by its children to the forest

If  $x$  is the minimum node do successive linking

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### Fibonacci heaps (analysis)

Want everything to be  $O(1)$  time except for delete and delete-min.

$\implies$  cascading cuts should pay for themselves

$\Phi$  (collection of heaps) = #(trees) + 2#(marked nodes)

Actual(decrease-key) =  $O(1)$  + #(cascading cuts)

$\Delta\Phi$ (decrease-key) =  $O(1)$  - #(cascading cuts)

$\implies$  amortized(decrease-key) =  $O(1)$  !

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### Fibonacci heaps (analysis)

What about delete and delete-min ?

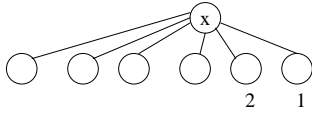
Cascading cuts and successive linking will pay for themselves. The only question is what is the maximum degree of a node ?

How many trees are being added into the forest when we chop off a root ?

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### Fibonacci heaps (analysis)

Lemma 1 : Let  $x$  be any node in an F-heap. Arrange the children of  $x$  in the order they were linked to  $x$ , from earliest to latest. Then the  $i$ -th child of  $x$  has rank at least  $i-2$ .



Proof:

When the  $i$ -th node was linked it must have had at least  $i-1$  children.  
 Since then it could have lost at most one. ■

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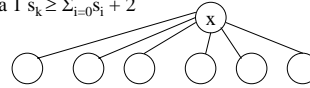
### Fibonacci heaps (analysis)

Corollary 1 : A node  $x$  of rank  $k$  in a F-heap has at least  $\phi^k$  descendants, where  $\phi = (1 + \sqrt{5})/2$  is the golden ratio.

Proof:

Let  $s_k$  be the minimum number of descendants of a node of rank  $k$  in a F-heap.

By Lemma 1  $s_k \geq \sum_{i=0}^{k-2} s_i + 2$



$s_0=1, s_1=2$

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### Fibonacci heaps (analysis)

Proof (cont):

Fibonacci numbers satisfy

$$F_{k+2} = \sum_{i=2}^k F_i + 2, \text{ for } k \geq 2, \text{ and } F_2=1$$

so by induction  $s_k \geq F_{k+2}$

It is well known that  $F_{k+2} \geq \phi^k$

It follows that the maximum degree  $k$  in a F-heap with  $n$  nodes is such that  $\phi^k \leq n$

$$\text{so } k \leq \log(n) / \log(\phi) = 1.4404 \log(n)$$

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