

# CS 240 – Data Structures and Data Management

## Module 2E: Priority Queues - Enriched

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Based on lecture notes by many previous cs240 instructors

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# Outline

- 2 Merging heaps
  - More PQ operations
  - Meldable Heaps
  - Binomial Heaps

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  - More PQ operations
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# Merging Priority Queues

**New operation:** *merge*( $P_1, P_2$ )

- Given: two priority queues  $P_1, P_2$  of size  $n_1$  and  $n_2$ .
- Want: One priority queue  $P$  that contains all their items

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Can we do it *faster* if PQs are stored as trees?

# Merging Priority Queues

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Can we do it *faster* if PQs are stored as trees?

Three approaches (where  $n = n_1 + n_2$ ):

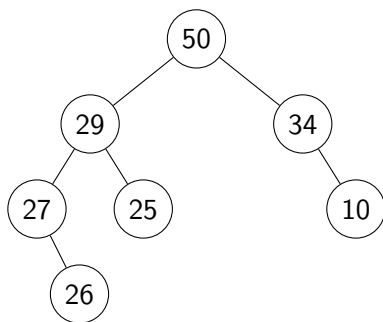
- Merge binary heaps (stored as trees).  
 $O(\log^3 n)$  worst-case time (no details)
- Merge *meldable heaps* that have heap-property (but not structural property).  $O(\log n)$  *expected* run-time.
- Merge *binomial heaps* that have a different structural property.  
 $O(\log n)$  *worst-case* run-time.

# Outline

- 2 Merging heaps
  - More PQ operations
  - **Meldable Heaps**
  - Binomial Heaps

# Meldable Heaps

- Priority queue stored as binary tree
- Heap-order-property: Parent no smaller than child.
- No structural property; any binary tree allowed.
- *Tree-based*: Store nodes and references to *left/right*





## PQ-operations in Meldable Heaps

Both *insert* and *deleteMax* can be done by *reduction* to *merge*.

*P.insert*( $k, v$ ):

- Create a 1-node meldable heap  $P'$  that stores  $(k, v)$ .
- Merge  $P'$  with  $P$ .

*P.deleteMax*():

- Stash item that is at root.
- Let  $P_\ell$  and  $P_r$  be left and right sub-heap of root.
- Update  $P \leftarrow \text{merge}(P_\ell, P_r)$
- Return stashed item.

Both operations have run-time  $O(\text{merge})$ .

# Merging Meldable Heaps

- Idea: Merge heap with smaller root into other one, *randomly* choose into which sub-heap to merge.
- Structural property not maintained

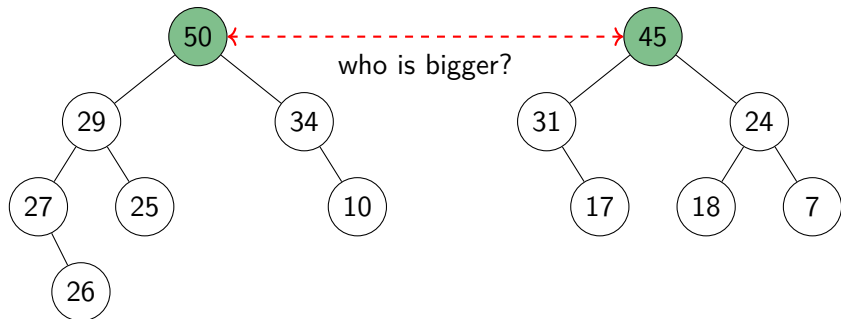
```
meldableHeap::merge( $r_1, r_2$ )
```

```
 $r_1, r_2$ : roots of two heaps (possibly NIL)
```

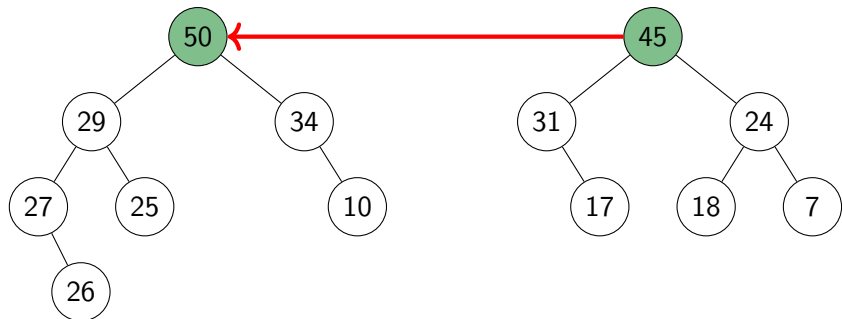
```
returns root of merged heap
```

1. **if**  $r_1$  is NIL **return**  $r_2$
2. **if**  $r_2$  is NIL **return**  $r_1$
3. **if**  $r_1.key < r_2.key$  *swap*( $r_1, r_2$ )
4. // now  $r_1$  has max-key and becomes the root.
5. *randomly* pick one child  $c$  of  $r_1$
6. replace subheap at  $c$  by *heapMerge*( $c, r_2$ )
7. **return**  $r_1$

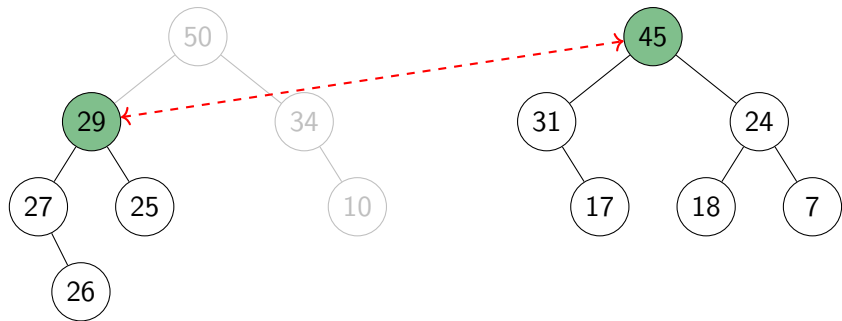
## Merge Example



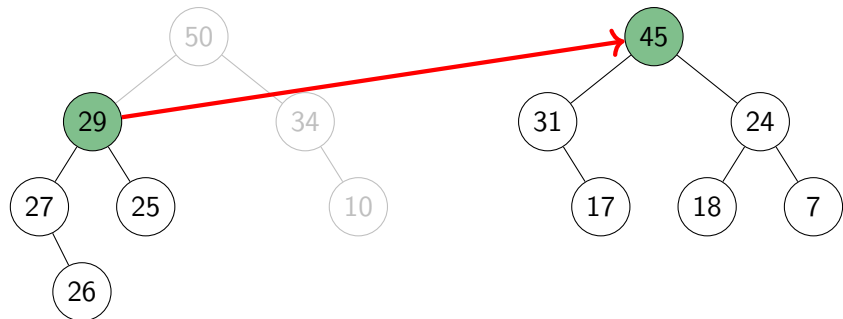
## Merge Example



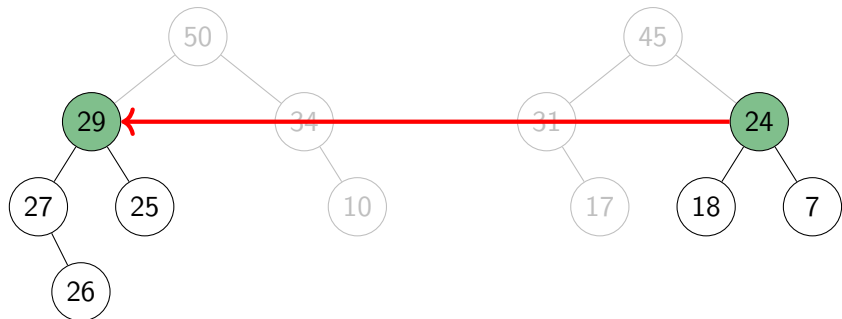
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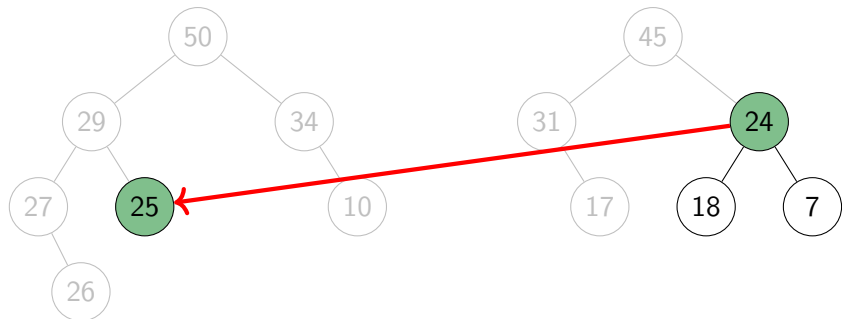
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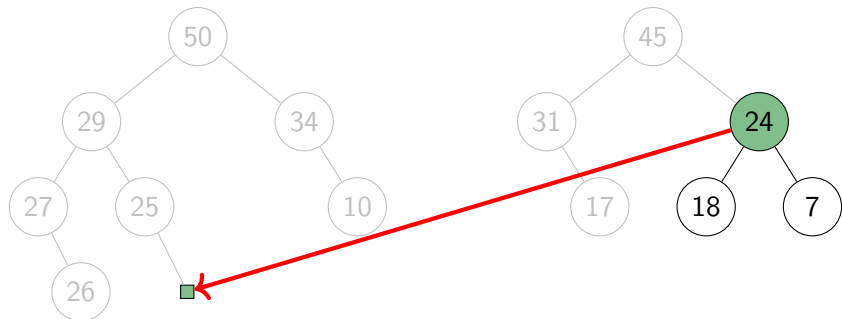


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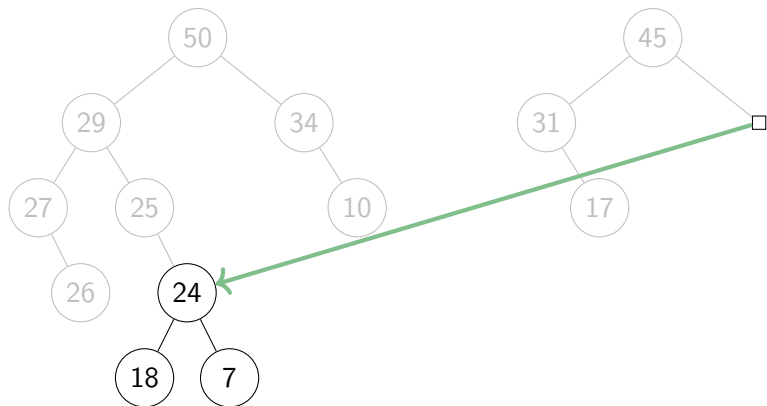




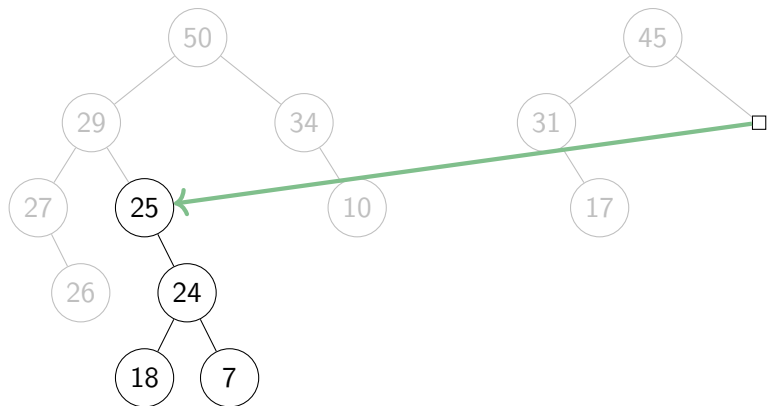
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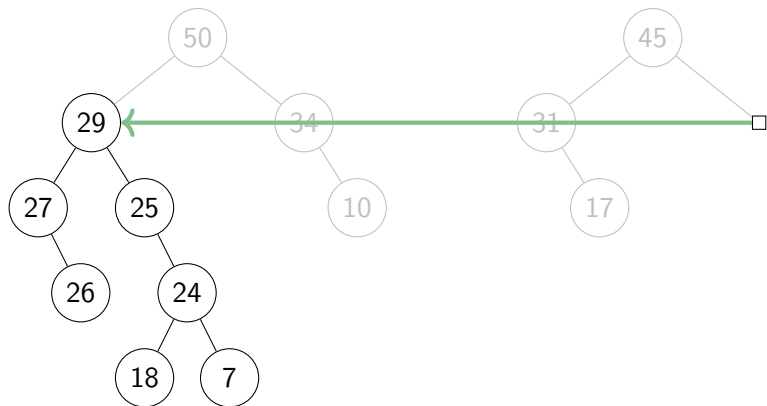
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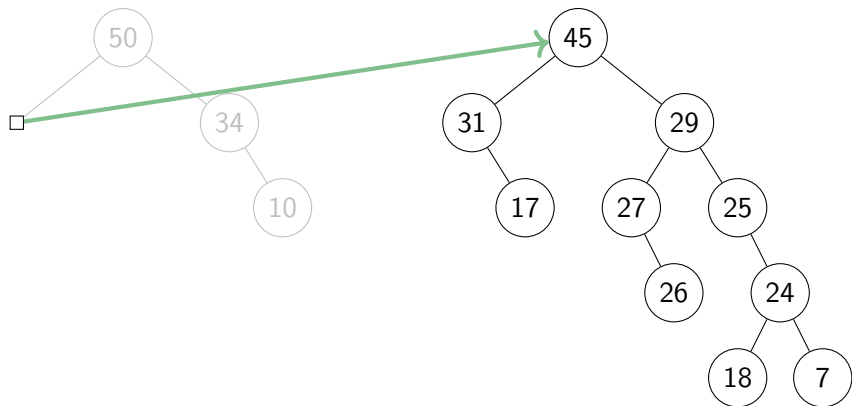
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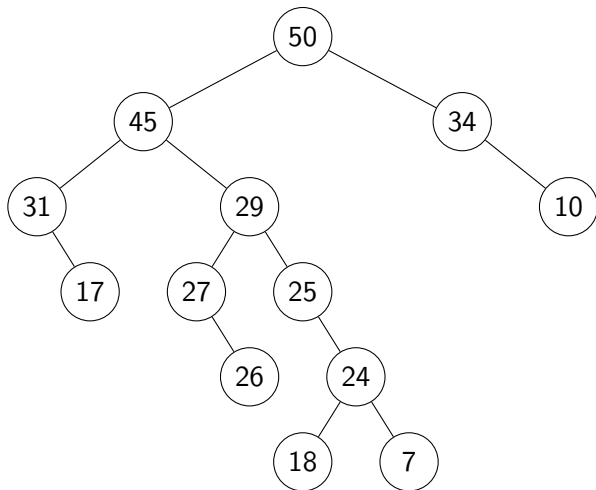
## Merge Example



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## Merge Example



## Merging meldable heaps

Run-time? Not more than two *random downward walks* in a binary tree.

Let  $T(n)$  = expected length of a random downward walk.

**Theorem:**  $T(n) \in O(\log n)$ .

**Proof:**

So *merge* (and also *insert* and *deleteMax*) takes  $O(\log n)$  expected time.

# Outline

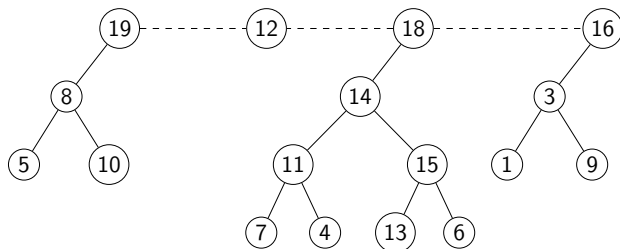
## 2 Merging heaps

- More PQ operations
- Meldable Heaps
- **Binomial Heaps**



# Binomial Heaps

Very different structure from binary heaps and meldable heaps:



- List  $L$  of binary trees.
- Each binary tree is a **flagged tree**:  
Complete binary tree  $T$  plus root  $r$  that has  $T$  as left subtree
  - ▶ Flagged tree of height  $h$  has  $2^h$  nodes.
  - ▶ So  $h \leq \log n$  for all flagged trees.
- Order-property: Nodes in *left* subtree have no-smaller keys.  
(No restrictions on nodes in the right subtree.)

# Binomial Heap Operations

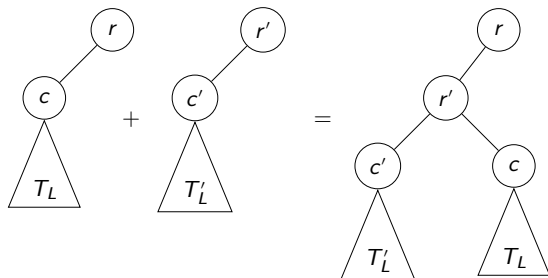
- *insert*: Reduce to *merge* as before.
- *findMax*:
  - ▶ At each flag tree, root contains the maximum.
  - ▶ Search roots in  $L \Rightarrow O(|L|)$  time.
- We want  $L$  to be short.

# Binomial Heap Operations

- *insert*: Reduce to *merge* as before.
- *findMax*:
  - ▶ At each flag tree, root contains the maximum.
  - ▶ Search roots in  $L \Rightarrow O(|L|)$  time.
- We want  $L$  to be short.
  
- **Proper binomial heap**: No two flagged trees have the same height.
- **Observation**: A proper binomial heap has  $|L| \leq \log n + 1$ .
  - ▶ The flagged tree of largest height  $h$  has  $h \leq \log n$ .
  - ▶ Can have only one flagged tree of each height in  $\{0, \dots, h\}$ .

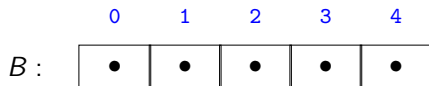
## Making Binomial Heaps Proper

- Goal: Given a binomial heap, make it proper.
- Need subroutine: combine two flagged trees of the same height. This can be done in constant time. If  $r.\text{key} \geq r'.\text{key}$ :

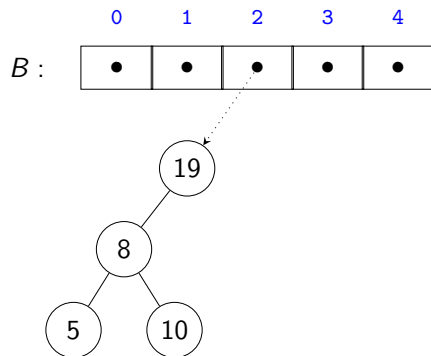


- Idea: Do this whenever two flagged trees have same height.
- Run-time to make proper:  $O(|L| + \log n)$  if implemented suitably.

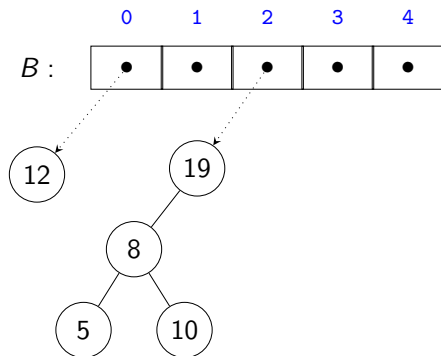
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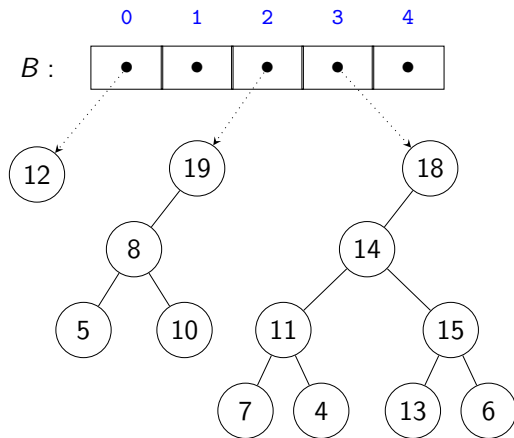
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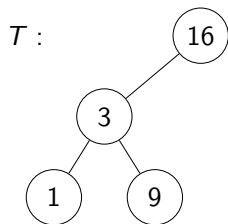
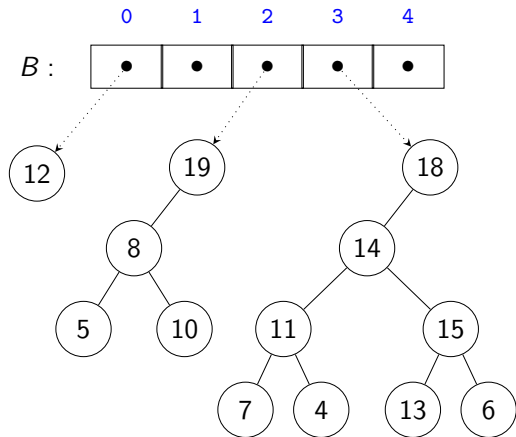


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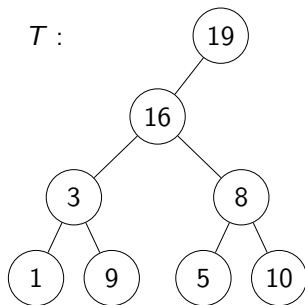
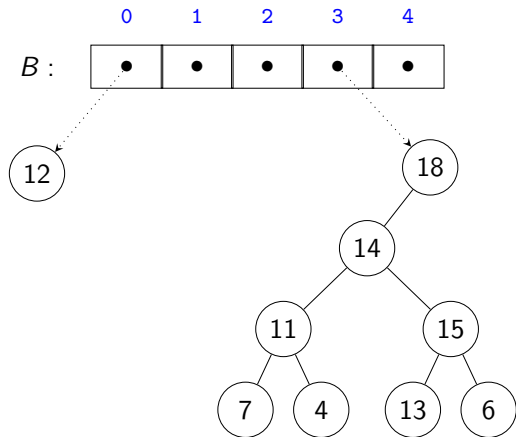




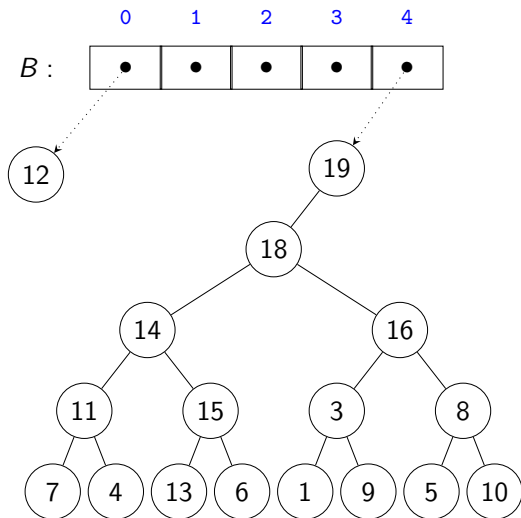
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*binomialHeap::makeProper()*

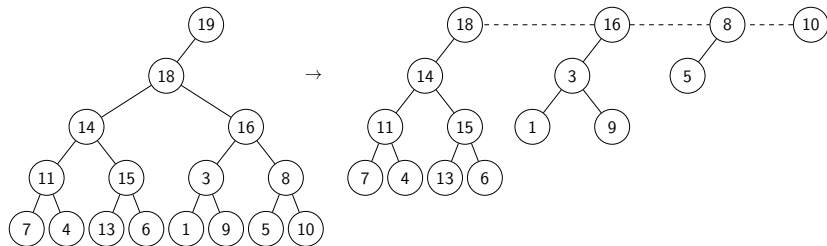
1.  $n \leftarrow$  size of the binomial heap
2. compute  $\ell \leftarrow \lfloor \log n \rfloor$
3.  $B \leftarrow$  array of size  $\ell + 1$ , initialized all-NIL
4.  $L \leftarrow$  list of flagged trees
5. **while**  $L$  is non-empty **do**
6.      $T \leftarrow L.pop()$ ,  $h \leftarrow T.height$
7.     **while**  $T' \leftarrow B[h]$  is not NIL **do**
8.         **if**  $T.root.key < T'.root.key$  **do** swap  $T$  and  $T'$
9.         // combine  $T$  with  $T'$
10.          $T'.right \leftarrow T.left$ ,  $T.left \leftarrow T'$ ,  $T.height \leftarrow h+1$
11.          $B[h] \leftarrow$  NIL,  $h++$
12.      $B[h] \leftarrow T$
13.     // copy  $B$  back to list
14.     **for** ( $h = 0$ ;  $h \leq \ell$ ;  $h++$ ) **do**
15.         **if**  $B[h] \neq$  NIL **do**  $L.append(B[h])$

# Binomial Heap Operations

- **Idea:** Make binomial heap proper after *every* operation.
  - ⇒  $L$  always has length  $O(\log n)$
  - ⇒ Each *makeProper* takes  $O(\log n)$  time
- *findMax*:  $O(\log n)$  worst-case time.
- *merge*:  $O(\log n)$  worst-case time.
  - ▶ Concatenate the two lists.
  - ▶ Call *makeProper*.
- *insert*:  $O(\log n)$  worst-case time via *merge*.
- *deleteMax*?

## deleteMax in a binomial heap

- Search for maximum among roots, say it is in tree  $T$
- Split  $T \setminus \{\text{root}\}$  into into flagged trees  $T_1, \dots, T_k$



- Merge  $L \setminus T$  with  $\{T_1, \dots, T_k\}$
- Have  $k \leq \log n \Rightarrow O(\log n)$  worst-case time.

**Summary:** All operations have  $O(\log n)$  worst-case run-time.