

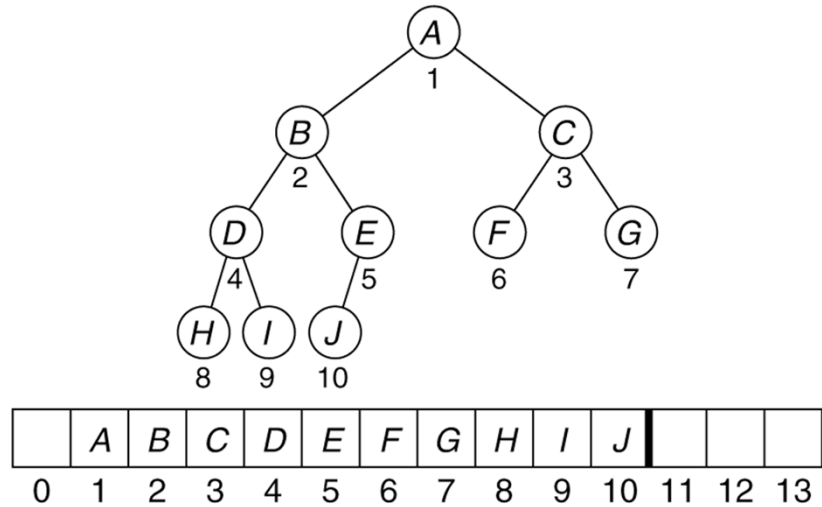
Priority Queue

Basic operations
Implementation options
Binary Heaps

Recap: Priority Queue operations

- ▶ Each element in the PQ has an associated **priority**, which is a non-negative integer.
- ▶ `findMin()`
- ▶ `insert(item, priority)`
- ▶ `deleteMin()`

Recap: A complete binary tree and its array representation



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Heap-order property



$$P \leq X$$

Figure 21.2
Heap-order property

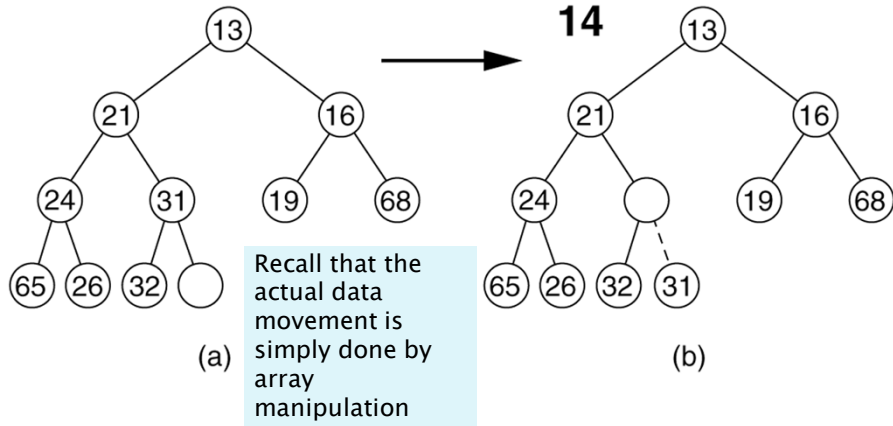
A **Binary Heap** is a complete Binary Tree (implemented as an array) that has the heap-order property.

- In a binary heap, where do we find
- The smallest element?
 - 2nd smallest?
 - 3rd smallest?

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Figure 21.7
Attempt to insert 14, creating the hole and bubbling the hole up

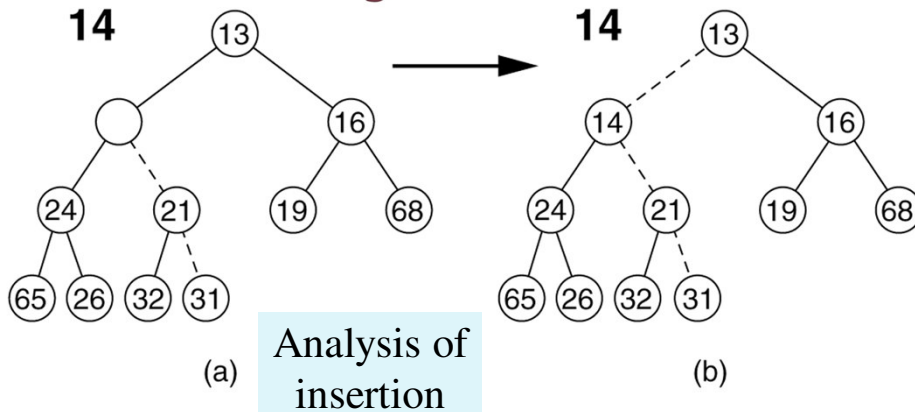
Insertion algorithm



Create a "hole" where 14 can be inserted.

Figure 21.8
The remaining two steps required to insert 14 in the original heap shown in Figure 21.7

Insertion Algorithm continued



Your turn: Insert into an initially empty heap:

6 4 8 1 5 3 2 7

Code for Insertion

```

public PriorityQueue.Position insert( Comparable x )
{
    if( currentSize + 1 == array.length )
        doubleArray( );

    // Percolate up
    int hole = ++currentSize;
    array[ hole ] = x;

    for( ; x.compareTo( array[ hole / 2 ] ) < 0; hole /= 2 )
        array[ hole ] = array[ hole / 2 ];
    array[ hole ] = x;

    return null;
}

```

DeleteMin algorithm

The *min* is at the root. Delete it, then use the **percolateDown** algorithm to find the correct place for its replacement.

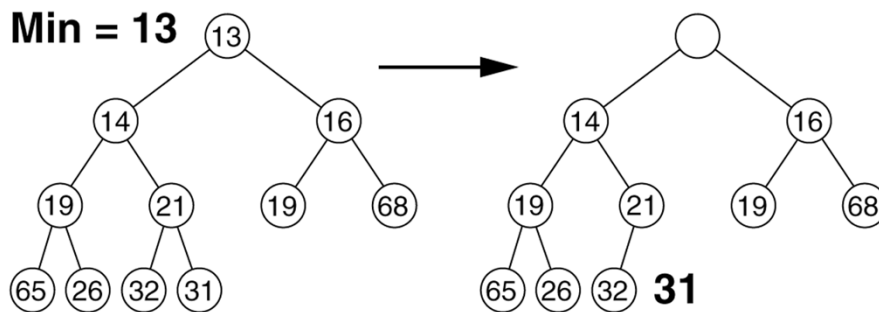
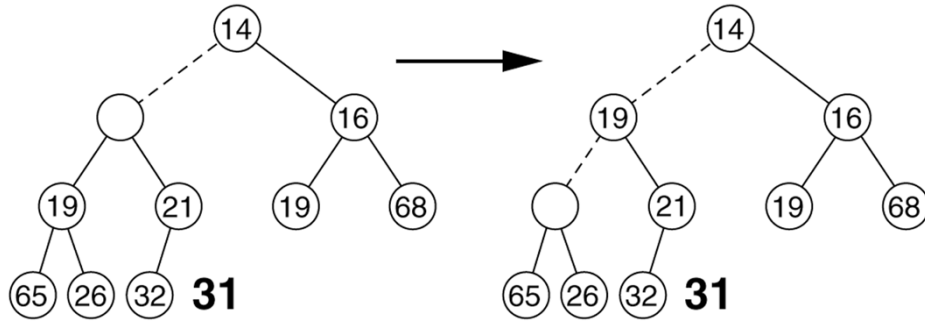


Figure 21.10 Creation of the hole at the root

Figure 21.11
The next two steps in the deleteMin operation

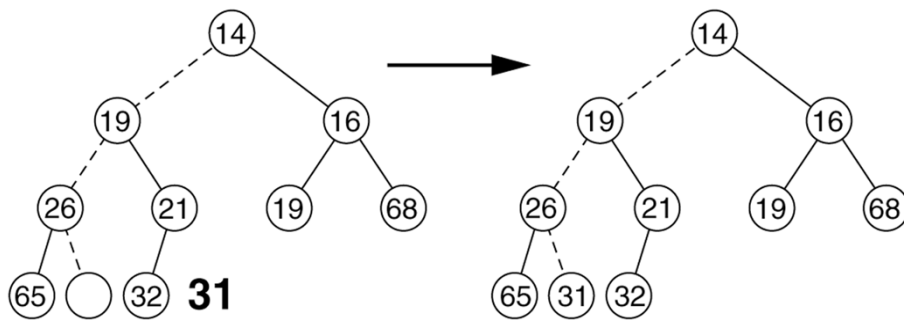
DeleteMin2



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Figure 21.12
The last two steps in the deleteMin operation

DeleteMin3



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```

public Comparable deleteMin( )
{
    Comparable minItem = findMin( );
    array[ 1 ] = array[ currentSize-- ];
    percolateDown( 1 );

    return minItem;
}
private void percolateDown( int hole )
{
    int child;
    Comparable tmp = array[ hole ];

    for( ; hole * 2 <= currentSize; hole = child )
    {
        child = hole * 2;
        if( child != currentSize &&
            array[ child + 1 ].compareTo( array[ child ] ) < 0 )
            child++;
        if( array[ child ].compareTo( tmp ) < 0 )
            array[ hole ] = array[ child ];
        else
            break;
    }
    array[ hole ] = tmp;
}

```

Compare node to its children,
moving root down and
promoting the smaller child until
proper place is found.

Analysis

Summary: Implementing a Priority Queue as a binary heap

- ▶ Worst case times:
 - findMin: $O(1)$
 - insert: $O(\log n)$
 - deleteMin $O(\log n)$
- ▶ big-oh times for insert/delete are the same as the balanced BST implementation,
 - but these operations are much simpler,
 - and don't require space for pointers.

Using a Heap for sorting

- ▶ Start with empty heap
- ▶ Insert each array element into heap
- ▶ Repeatedly do **deleteMin**, copying elements back into array.
- ▶ <http://nova.umuc.edu/~jarc/idsv/lesson3.html>
 - Can be run in demo mode or practice mode.
- ▶ We can save space by doing the whole sort in place, using a "maxHeap" (i.e. a heap where the maximum element is at the root instead of the minimum)
- ▶ Analysis?
 - **Next slide ...**

Analysis of simple heapsort

- ▶ Add the elements to the heap
 - Repeatedly call insert
- ▶ Remove the elements and place into the array
 - Repeatedly call DeleteMin
- ▶ We can do better for the insertion part by using BuildHeap

BuildHeap takes a complete tree that is not a heap and exchanges elements to get it into heap form

At each stage it takes a root plus two heaps and "percolates down" the root to restore "heapness" to the entire subtree

```
/**
 * Establish heap order property from an arbitrary
 * arrangement of items. Runs in linear time.
 */
private void buildHeap( )
{
    for( int i = currentSize / 2; i > 0; i-- )
        percolateDown( i );
}
```

Why this starting point?

Figure 21.17 Implementation of the linear-time buildHeap method

```
private void buildHeap( )
{
    for( int i = currentSize / 2; i > 0; i-- )
        percolateDown( i );
}
```

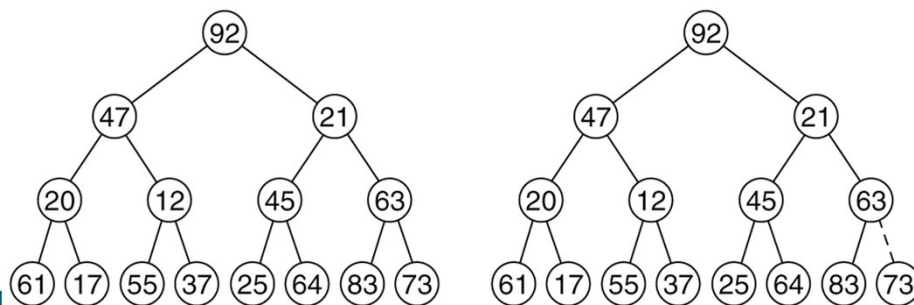
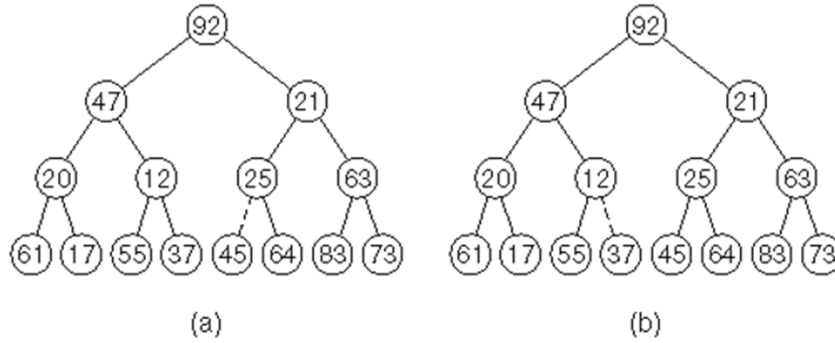
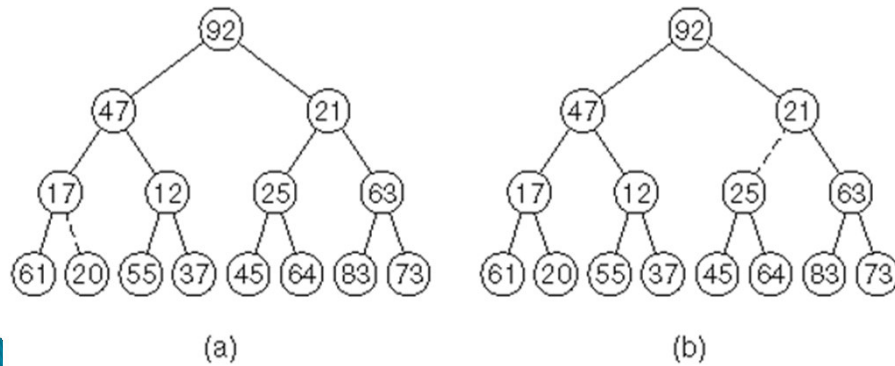


Figure 21.18
 (a) After percolateDown(6);
 (b) after percolateDown(5)



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Figure 21.19
 (a) After percolateDown(4);
 (b) after percolateDown(3)

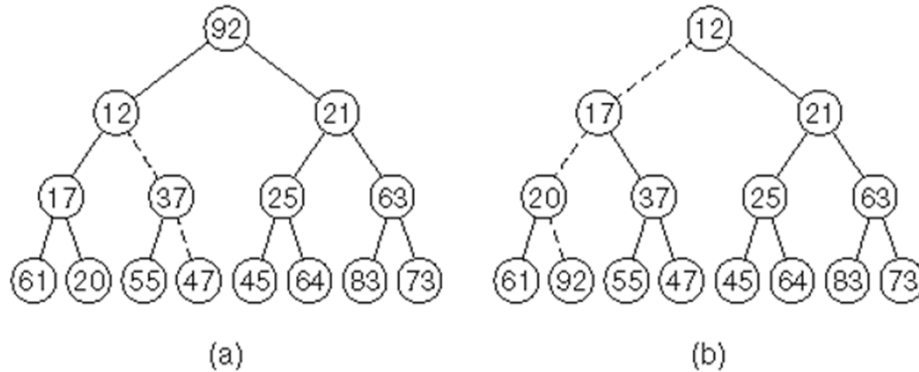


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Figure 21.20

(a) After percolateDown(2);

(b) after percolateDown(1) and buildHeap terminates



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Analysis of BuildHeap

- ▶ Find a summation that represents the maximum number of comparisons required to rearrange an array into a heap
- ▶ Evaluate the sum
- ▶ This was part of WA10

◦ The summation is $\sum_{k=0}^H k 2^{H-k}$.

and the sum is $N - H + 1$

Further discussion of Hashing

Collision Resolution

Review of Hash Table ideas

- ▶ How is the data stored?
- ▶ How are the hash code and array capacity used?
- ▶ What is a collision?
- ▶ How do we attempt to avoid collisions?
- ▶ Why can we seldom guarantee that there will be no collisions?

Collision Resolution: Linear Probing

- ▶ When an item hashes to a table location occupied by a non-equal item, simply use the next available space.
- ▶ Try $H+1$, $H+2$, $H+3$, ...
 - With wraparound at the end of the array
- ▶ Problem: Clustering (picture on next slide)
- ▶ http://www.cs.auckland.ac.nz/software/AlgA/nim/hash_tables.html
- ▶ We'll let it keep running while we look at analysis.

Figure 20.4
Linear probing hash
table after each
insertion

hash (89, 10) = 9
hash (18, 10) = 8
hash (49, 10) = 9
hash (58, 10) = 8
hash (9, 10) = 9

	<i>After insert 89</i>	<i>After insert 18</i>	<i>After insert 49</i>	<i>After insert 58</i>	<i>After insert 9</i>
0			49	49	49
1				58	58
2					9
3					
4					
5					
6					
7					
8		18	18	18	18
9	89	89	89	89	89

Analysis of linear probing

- ▶ Dependent on the **load factor**, λ , which is the ratio of the number of items in the table to the size of the table. Thus $0 \leq \lambda \leq 1$.
- ▶ For a given λ , what is the expected number of probes before an empty location is found?
- ▶ For simplicity, assume that all locations are equally likely to be occupied, and equally likely to be the next one we look at. Then the probability that a given cell is empty is $1 - \lambda$, and thus the expected number of probes before finding an empty cell is (write it as a summation).

```
> simplify(sum(i*(1-lambda)*lambda^(i-1), i=1..infinity));
```

$$-\frac{1}{\lambda - 1}$$

- ▶ For example, if λ is 0.75, the expected value is 4.

Analysis of linear probing (continued)

- ▶ The "equally likely" probability is not realistic, because of **clustering**
- ▶ Large blocks of consecutive occupied cells are formed. Any attempt to place a new item in any of those cells results in extending the cluster by at least one item
- ▶ Thus items collide not only because of identical hash values, but also because of hash values that happen to put them into the cluster
- ▶ Average number of probes when λ is large:
 - $0.5 [1 + 1/(1 - \lambda)^2]$.
 - For a proof, see Knuth, *The Art of Computer Programming*, Vol 3: Searching Sorting, 2nd ed, Addison-Wesley, Reading, MA, 1998.
 - What are the values for $\lambda = 0, 0.5, 0.75, 0.9$?
 - **When λ approaches 1, this gets bad!**
 - But if λ is close to zero, then the average is near 1.0

So why consider linear probing?

- ▶ Easy to implement
- ▶ Simple code has fast run time per probe
- ▶ Works well when load is low
 - It could be more efficient just to rehash using a bigger table once it starts to fill.
 - Typically done in practice: rehash to an array that is double in size once the load goes over 0.5
- ▶ What about other fast, easy-to-implement strategies?

Quadratic probing

- ▶ With linear probing, if there is a collision at H , we try H , $H+1$, $H+2$, $H+3$,... until we find an empty spot.
 - Causes (primary) clustering
- ▶ With quadratic probing, we try H , $H+1^2$, $H+2^2$, $H+3^2$,...
 - Eliminates primary clustering, but can cause secondary clustering.

Hints for quadratic probing

- ▶ **Choose a prime number for the array size**
 - Guaranteed insertion and no cell is probed twice, provided That the table is no more than half full.
 - Suppose the array size is P, a prime number greater than 3
 - Show by contradiction that if i and j are $\leq \lfloor P/2 \rfloor$, and $i \neq j$, then $H + i^2 \pmod{P} \neq H + j^2 \pmod{P}$.
- ▶ **Use an algebraic trick to calculate next index**
 - Replaces mod and general multiplication with subtraction and a bit shift
 - Difference between successive probes:
 - $H + (i+1)^2 = H + i^2 + (2i+1)$ [can use bit-shift for multiplication].
 - `nextProbe = nextProbe + (2i+1);`
 if (`nextProbe >= P`) `nextProbe -= P;`