

Sorting (ii)

- Summary of Sorting Methods
- Lower Bound for Comparison-Based Sorting
- Radix Sort

❖ Summary of Sorting Methods

Sorting = arrange a collection of N items in ascending order
...

Elementary sorting algorithms: $O(N^2)$ comparisons

- selection sort, insertion sort, bubble sort

Advanced sorting algorithms: $O(N \log N)$ comparisons

- quicksort, merge sort, heap sort (priority queue)

Most are intended for use in-memory (random access data structure).

Merge sort adapts well for use as disk-based sort.

❖ ... Summary of Sorting Methods

Other properties of sort algorithms: stable, adaptive

Selection sort:

- stability depends on implementation
- not adaptive

Bubble sort:

- is stable if items don't move past same-key items
- adaptive if it terminates when no swaps

Insertion sort:

- stability depends on implementation of insertion
- adaptive if it stops scan when position is found

❖ ... Summary of Sorting Methods

Other properties of sort algorithms: stable, adaptive

Quicksort:

- easy to make stable on lists; difficult on arrays
- can be adaptive depending on implementation

Merge sort:

- is stable if merge operation is stable
- can be made adaptive (but version in slides is not)

Heap sort:

- is not stable because of top-to-bottom nature of heap ordering
- adaptive variants of heap sort exist (faster if data almost sorted)

❖ Lower Bound for Comparison-Based Sorting

All of the above sorting algorithms for arrays of n elements

- have **comparing whole keys** as a critical operation

Such algorithms cannot work with less than $O(n \log n)$ comparisons

Informal proof (for arrays with no duplicates):

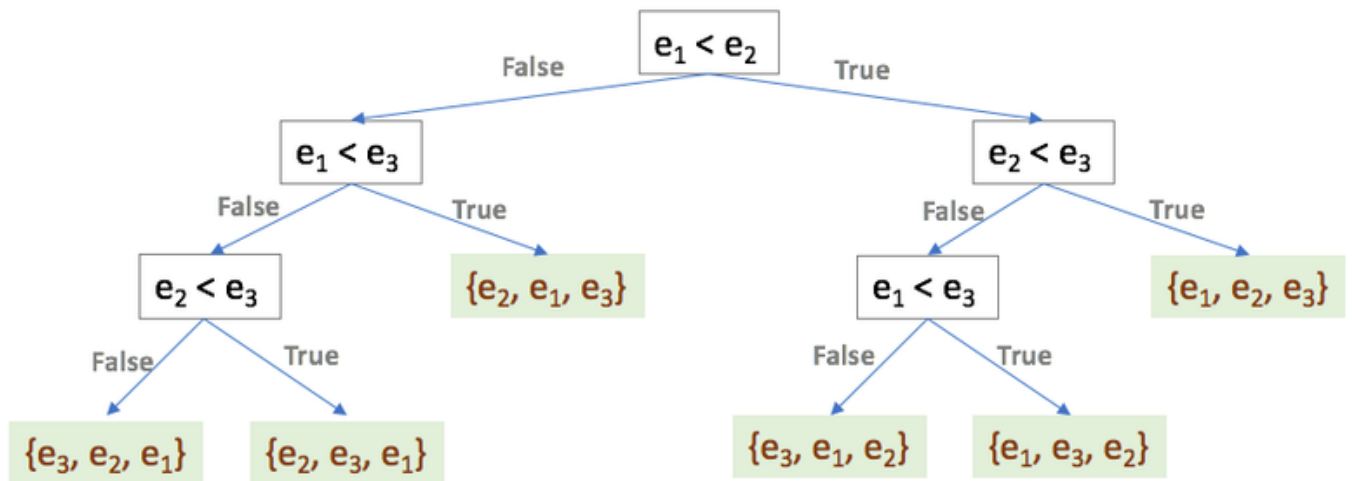
- there are $n!$ possible permutation sequences
- one of these possible sequences is a sorted sequence
- each comparison reduces # possible sequences to be considered

(continued ...)

❖ ... Lower Bound for Comparison-Based Sorting

Can view sorting as navigating a **decision tree** ...

Decision Tree for input with three elements $\{e_1, e_2, e_3\}$



(continued ...)

❖ ... Lower Bound for Comparison-Based Sorting

Can view the sorting process as

- following a path from the root to a leaf in the decision tree
- requiring one comparison at each level

For n elements, there are $n!$ leaves

- height of such a tree is at least $\log_2(n!)$
⇒ number of comparisons required is at least $\log_2(n!)$

So, for comparison-based sorting, lower bound is $\Omega(n \log_2 n)$.

Are there faster algorithms not based on whole key comparison?

❖ Radix Sort

Radix sort is a non-comparative sorting algorithm.

Requires us to consider a key as a tuple (k_1, k_2, \dots, k_m) , e.g.

- represent key 372 as (3, 7, 2)
- represent key "sydney" as (s, y, d, n, e, y)

Assume only small number of possible values for k_i , e.g.

- numeric: 0-9 ... alpha: a-z

If keys have different lengths, pad with suitable character, e.g.

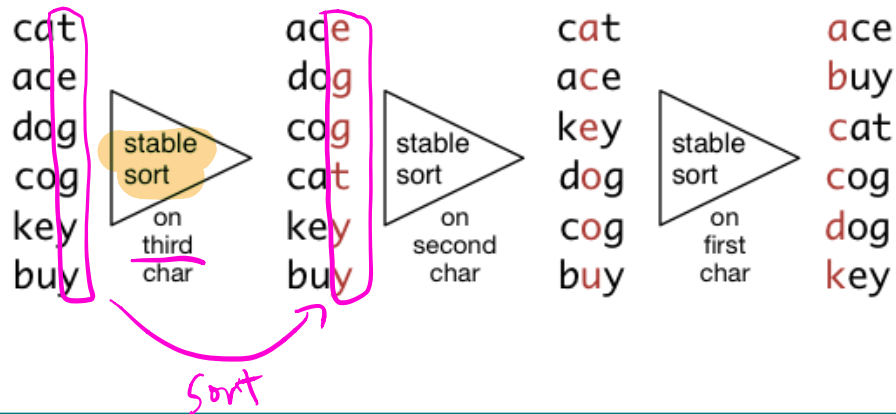
- numeric: 123, 002, 015 ... alpha: "abc", "zz_", "t_"

❖ ... Radix Sort

Radix sort algorithm:

- stable sort on k_m ,
- then stable sort on $k_{(m-1)}$,
- continue until we reach k_1

Example:



❖ ... Radix Sort

Stable sorting (bucket sort):

```
// sort array A[n] of keys
// each key is m symbols from an "alphabet"
// array of buckets, one for each symbol
for each i in m .. 1 do
  empty all buckets
  for each key in A do
    append key to bucket[key[i]]
  end for
  clear A
  for each bucket in order do
    for each key in bucket do
      append to array
    end for
  end for
end for
```

❖ ... Radix Sort

Example:

- $m = 3$, alphabet = {'a', 'b', 'c'}, $B[]$ = buckets
- $A[] = \{\text{"abc"}, \text{"cab"}, \text{"baa"}, \text{"a_"}, \text{"ca_"}\}$

After first pass ($i = 3$): *end.*

- $B['a'] = \{\text{"baa"}, \text{"cab"}, \text{"abc"}\}$, $B['b'] = \{\text{"a_"}, \text{"ca_"}\}$, $B['c'] = \{\}$, $B['_'] = \{\}$
- $A[] = \{\text{"baa"}, \text{"cab"}, \text{"abc"}, \text{"a_"}, \text{"ca_"}\}$

After second pass ($i = 2$): *middle*

- $B['a'] = \{\text{"baa"}, \text{"cab"}, \text{"ca_"}\}$, $B['b'] = \{\text{"abc"}\}$, $B['c'] = \{\}$, $B['_'] = \{\text{"a_"}\}$
- $A[] = \{\text{"baa"}, \text{"cab"}, \text{"ca_"}, \text{"abc"}, \text{"a_"}\}$

After third pass ($i = 1$):

- $B['a'] = \{\text{"abc"}, \text{"a_"}\}$, $B['b'] = \{\text{"baa"}\}$, $B['c'] = \{\text{"cab"}, \text{"ca_"}\}$, $B['_'] = \{\}$
- $A[] = \{\text{"abc"}, \text{"a_"}, \text{"baa"}, \text{"cab"}, \text{"ca_"}\}$

❖ ... Radix Sort

Complexity analysis:

- array contains n keys, each key contains m symbols
- stable sort (bucket sort) runs in time $O(n)$
- radix sort uses stable sort m times

So, time complexity for radix sort = $O(mn)$

Radix sort performs better than comparison-based sorting algorithms

- when keys are short (small m) and arrays are large (large n)

$$m \ll \log_2 n$$

Heaps and Priority Queues

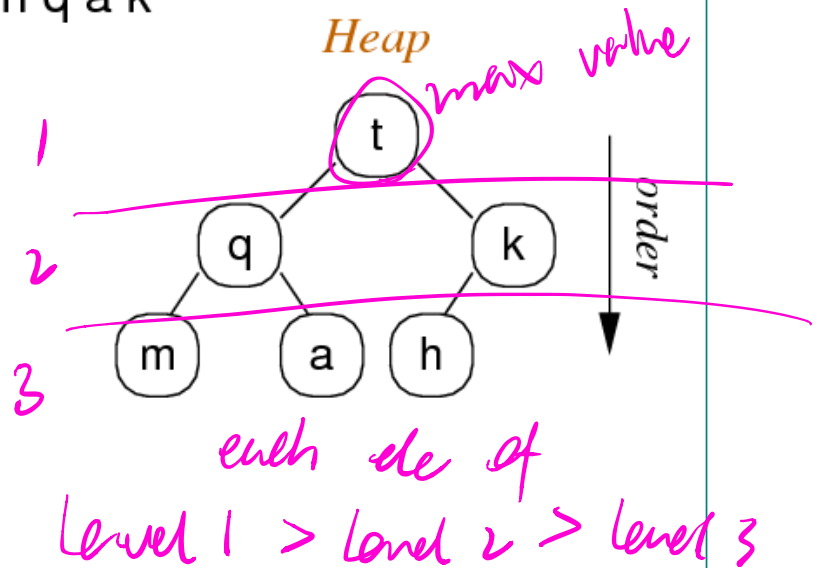
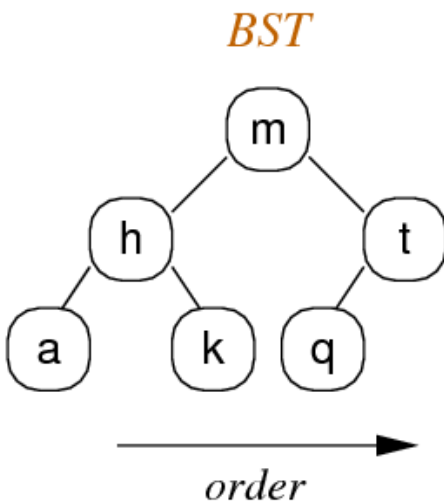
- Heaps
- Insertion with Heaps
- Deletion with Heaps
- Cost Analysis
- Priority Queues

❖ Heaps

Heaps can be viewed as trees with top-to-bottom ordering

- cf. binary search trees which have left-to-right ordering

Items inserted in order
m t h q a k



❖ ... Heaps

Heap characteristics ...

- priorities determined by order on keys
- new items **added initially at lower-most, right-most leaf**
- then new item **"drifts up"** to appropriate level in tree
- items are always **deleted by removing root** (top priority)

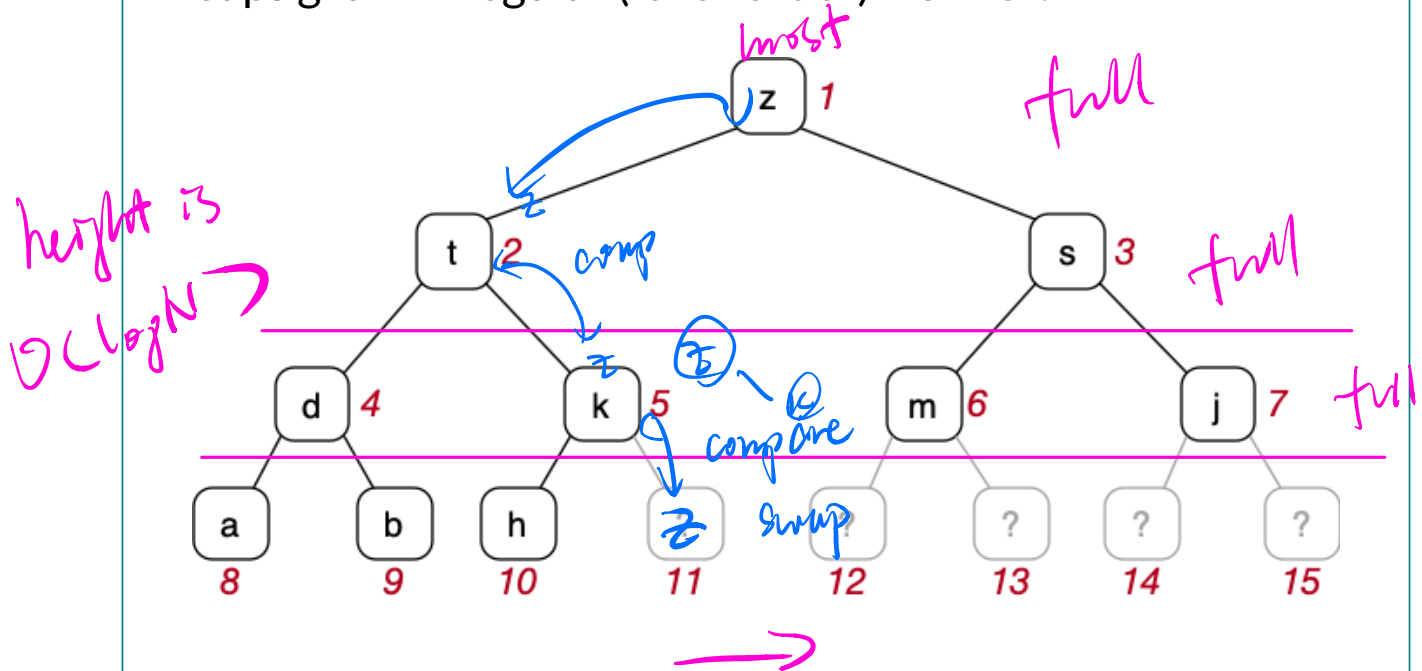
Since heaps are *dense* trees, $\text{depth} = \text{floor}(\log_2 N) + 1$

Insertion cost = $O(\log N)$, Deletion cost = $O(\log N)$

Heaps are typically used for implementing **Priority Queues**

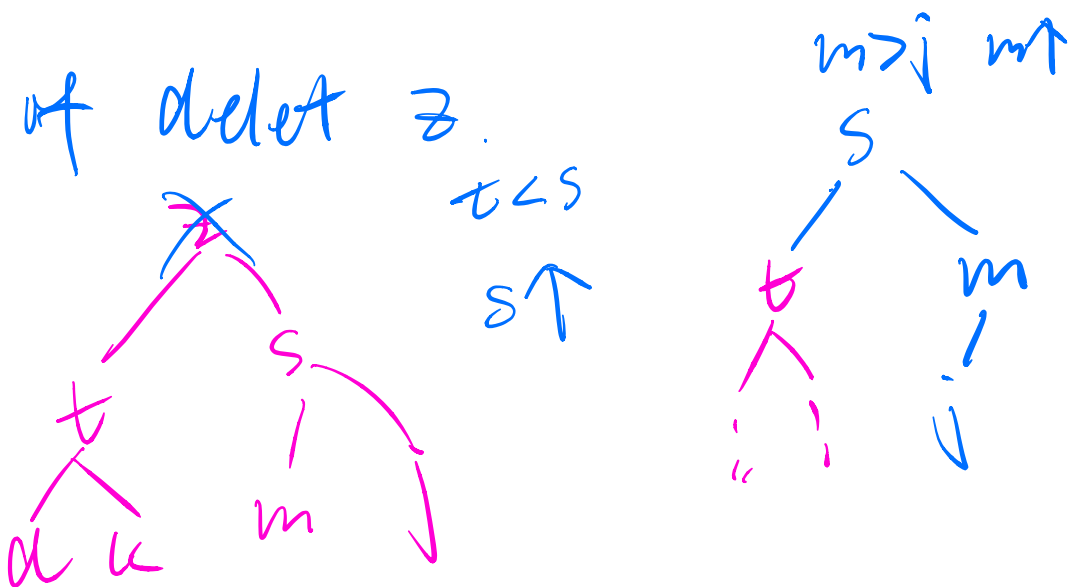
❖ ... Heaps

Heaps grow in regular (level-order) manner:



Nodes are always added in sequence indicated by numbers

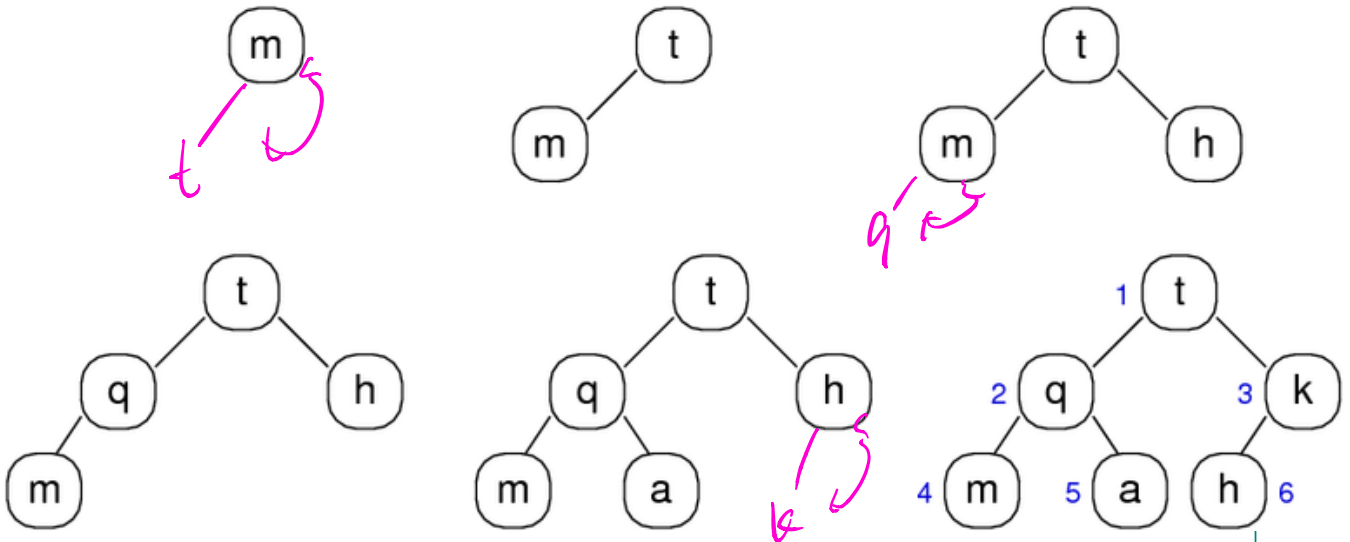
If add z



❖ ... Heaps

Trace of growing heap ...

Items inserted in order m t h q a k



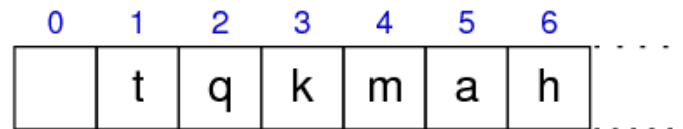
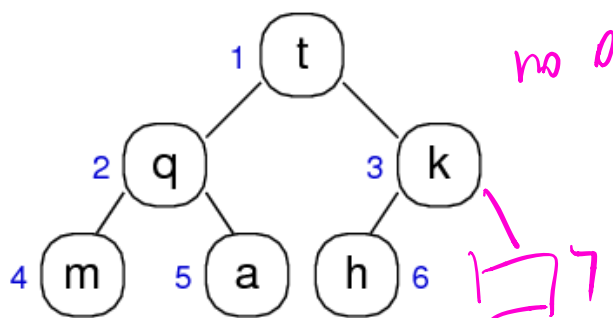
❖ ... Heaps

BSTs are typically implemented as linked data structures.

Heaps are often implemented via arrays (assumes we know max size)

Simple index calculations allow navigation through the tree:

- left child of **Item** at index i is located at $2i$ 2, 4, 6
- right child of **Item** at index i is located at $2i+1$ 5, 3
- parent of **Item** at index i is located at $i/2$



5 is parent $5/2=2.5$

$i=3$
 $2i=6$ left
 $2i+1=7$ right

13 ✓

2
5

❖ ... Heaps

Heap data structure:

```
typedef struct HeapRep {  
    Item *items;    // array of Items  
    int  nitems;    // #items in array  
    int  nslots;    // #elements in array  
} HeapRep;  
  
typedef HeapRep *Heap;
```

Initialisation: **nitems=0**, **nslots=ArraySize**

One difference: we use indexes from **1..nitems**

Note: unlike "normal" C arrays, **nitems** also gives index of last item

❖ ... Heaps

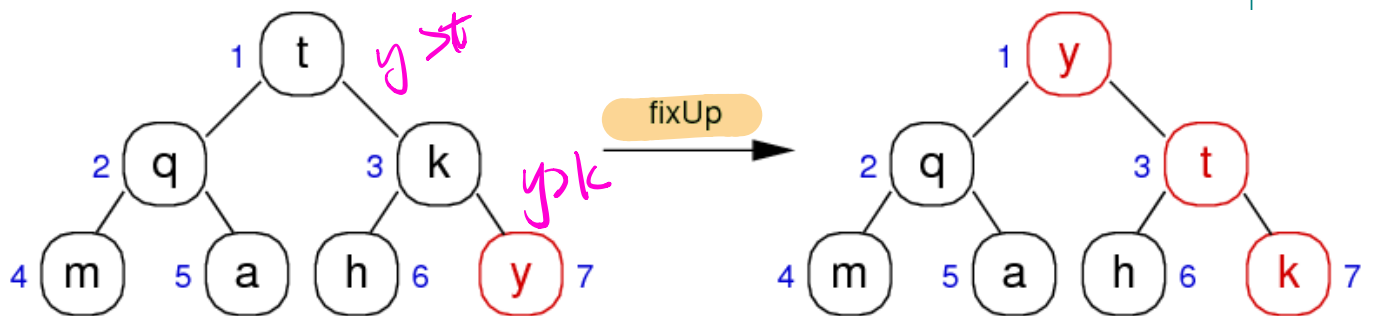
Creating new heap:

```
Heap newHeap(int N)
{
    Heap new = malloc(sizeof(HeapRep));
    Item *a = malloc((N+1)*sizeof(Item));
    assert(new != NULL && a != NULL);
    new->items = a; // no initialisation needed
    new->nitems = 0; // counter and index
    new->nslots = N; // index range 1..N
    return new;
}
```

❖ Insertion with Heaps

Insertion is a two-step process

- add new element at next available position on bottom row
(but this might violate heap property; new value larger than parent)
- reorganise values along path to root to restore heap property



❖ ... Insertion with Heaps

Insertion into heap:

```
void HeapInsert(Heap h, Item it)
{
    // is there space in the array?
    assert(h->nitems < h->nslots);
    h->nitems++;
    // add new item at end of array
    h->items[h->nitems] = it;
    // move new item to its correct place
    fixUp(h->items, h->nitems);
}
```

❖ ... Insertion with Heaps

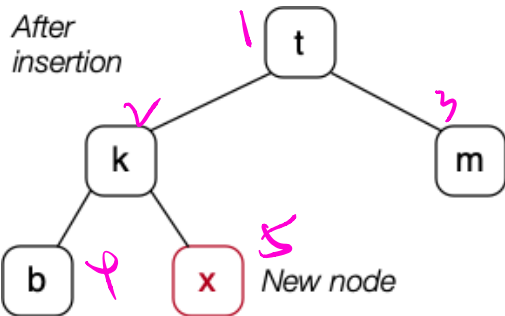
Bottom-up heapify:

```
// force value at a[i] into correct position
void fixUp(Item a[], int i)
{
    while (i > 1 && less(a[i/2], a[i])) {
        swap(a, i, i/2); // parent
        i = i/2; // integer division
    }
}

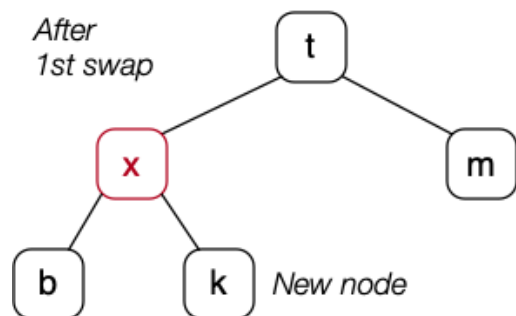
void swap(Item a[], int i, int j)
{
    Item tmp = a[i];
    a[i] = a[j];
    a[j] = tmp;
}
```

❖ ... Insertion with Heaps

Trace of **fixUp** after insertion ..



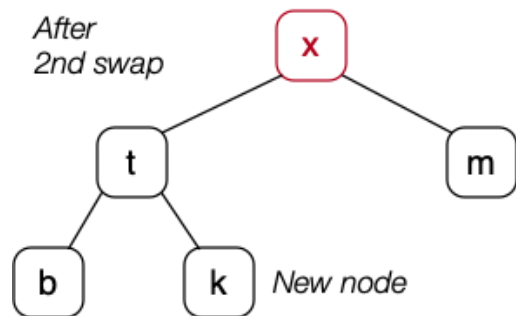
| [0] | [1] | [2] | [3] | [4] | [5] | [6] | [7] |
|-----|-----|-----|-----|-----|-----|-----|-----|
| - | t | k | m | b | x | - | - |



$x/h=2$

| [0] | [1] | [2] | [3] | [4] | [5] | [6] | [7] |
|-----|-----|-----|-----|-----|-----|-----|-----|
| - | t | x | m | b | k | - | - |

swap



$2/1=1$

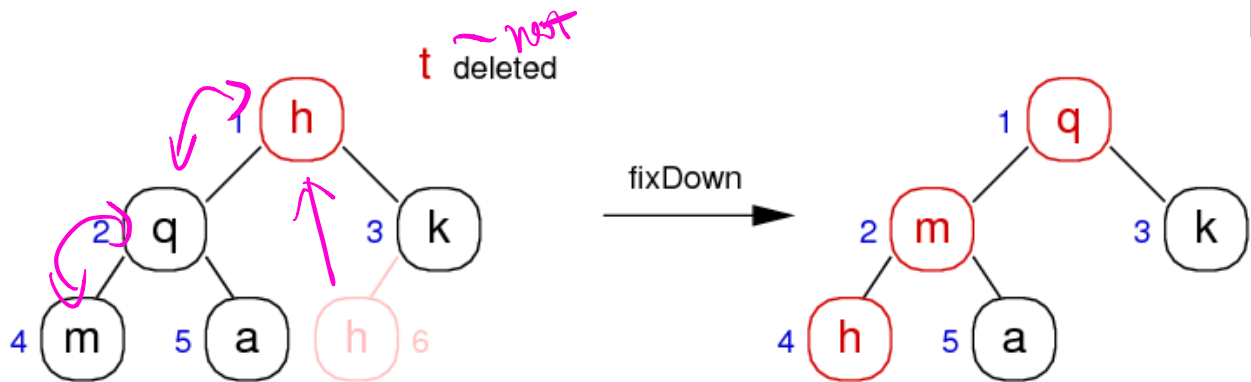
| [0] | [1] | [2] | [3] | [4] | [5] | [6] | [7] |
|-----|-----|-----|-----|-----|-----|-----|-----|
| - | x | t | m | b | k | - | - |

swap

❖ Deletion with Heaps

Deletion is a three-step process:

- replace root value by bottom-most, rightmost value
- remove bottom-most, rightmost value
- reorganise values along path from root to restore heap



❖ ... Deletion with Heaps

Deletion from heap (always remove root):

```
Item HeapDelete(Heap h)
{
    Item top = h->items[1];
    // overwrite first by last
    h->items[1] = h->items[h->nitems];
    h->nitems--;
    // move new root to correct position
    fixDown(h->items, 1, h->nitems);
    return top;
}
```

❖ ... Deletion with Heaps

Top-down heapify:

```
// force value at a[i] into correct position
// note that N gives max index *and* # items
void fixDown(Item a[], int i, int N)
{
    while (2*i <= N) {
        // compute address of left child
        int j = 2*i;
        // choose larger of two children
        if (j < N && less(a[j], a[j+1])) j++;
        if (!less(a[i], a[j])) break;
        swap(a, i, j);
        // move one level down the heap
        i = j;
    }
}
```

❖ Cost Analysis

Recall: tree is compact; max path length = $\log_2 n$

For insertion ...

- add new item at end of array $\Rightarrow O(1)$
- move item up into correct position $\Rightarrow O(\log_2 n)$

For deletion ...

- replace root by item at end of array $\Rightarrow O(1)$
- move new root down into correct position $\Rightarrow O(\log_2 n)$

❖ Priority Queues

Heap behaviour is exactly behaviour required for Priority Queue ...

- **join(PQ, it)**: ensure highest priority item at front of queue
- **it = leave(PQ)**: take highest priority item from queue

So ...

```
typedef Heap PQueue;  
void join(PQueue pq, Item it) { HeapInsert(pq, it); }  
Item leave(PQueue pq) { return HeapDelete(pq); }
```

❖ ... Priority Queues

Heaps are not the only way to implement priority queues ...

Comparison of different Priority Queue representations:

| | Array (sorted) | Array (unsorted) | List (sorted) | List (unsorted) | Heap |
|-------------|-------------------|---------------------|------------------|--------------------|-------------|
| space usage | $O(N)^*$ | $O(N)^*$ | $O(N)$ | $O(N)$ | $O(N)^*$ |
| join | $O(N)$ | $O(1)$ | $O(N)$ | $O(1)$ | $O(\log N)$ |
| leave | $O(N)$ | $O(N)$ | $O(1)$ | $O(N)$ | $O(\log N)$ |
| is empty? | $O(1)$ | $O(1)$ | $O(1)$ | $O(1)$ | $O(1)$ |

best

for a Priority Queue containing N items

* If fixed-size array (no realloc), choose max N that might ever be needed