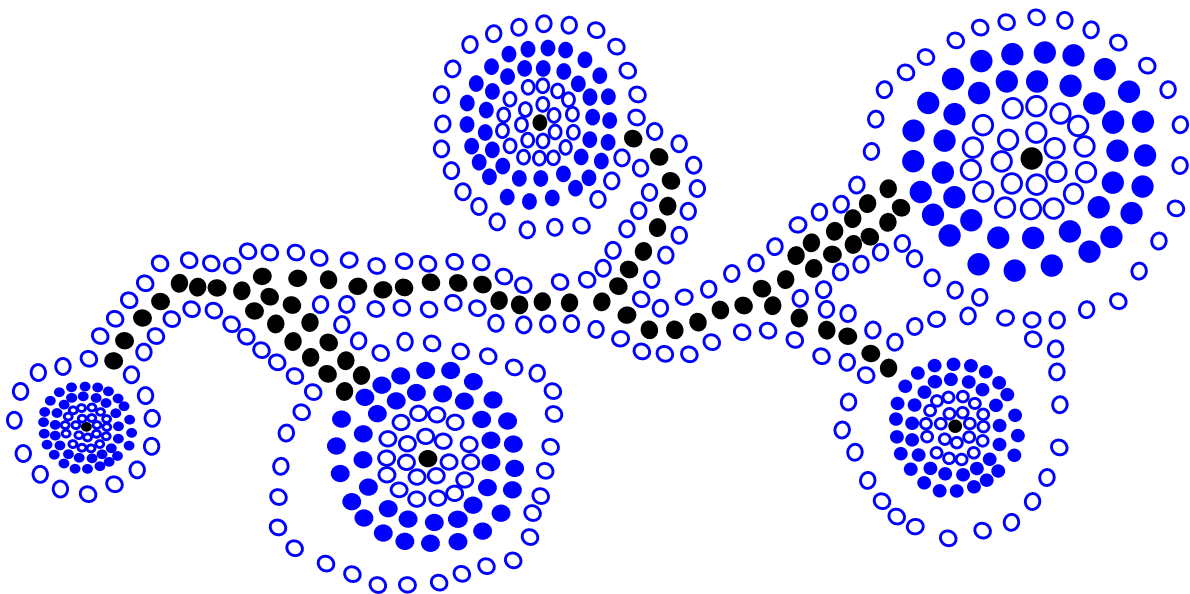


PRIORITY QUEUES

- Stock trading (motivation)
- The priority queue ADT
- Implementing a priority queue with a sequence
- Elementary sorting
- Issues in sorting



Stock Trading

- We focus on the trading of a single security, say Akamai Technologies, founded in 1998 by CS professors and students at MIT (200 employees, \$20B market cap)
- Investors place *orders* consisting of three items (*action, price, size*), where *action* is either *buy* or *sell*, *price* is the worst price you are willing to pay for the purchase or get from your sale, and *size* is the number of shares
- At equilibrium, all the buy orders (*bids*) have prices lower than all the sell orders (*asks*)
- A *level 1 quote* gives the highest bid and lowest ask (as provided by popular financial sites, and e-brokers for the naive public)
- A *level 2 quote* gives all the bids and asks for several price steps (Island ECN on the Web and quote subscriptions for professional traders)
- A *trade* occurs whenever a new order can be matched with one or more existing orders, which results in a series of *removal* transactions
- Orders may be *anceled* at any time

Data Structures for the Stock Market

- For each security, we keep two structures, one for the buy orders (bids), and the other for the sell orders (asks)
- Operations that need to be supported

<i>Action</i>	<i>Ask Structure</i>	<i>Bid Structure</i>
place an order	<i>insert(price, size)</i>	<i>insert(price, size)</i>
get level 1 quote	<i>min()</i>	<i>max()</i>
trade	<i>removeMin()</i>	<i>removeMax()</i>
cancel	<i>remove(order)</i>	<i>remove(order)</i>

- These data structures are called **priority queues**.
- The NASDAQ priority queues support an average daily trading volume of 1B shares (\$50B)

Keys and Total Order Relations

- A **Priority Queue** ranks its elements by *key* with a *total order* relation
- Keys:
 - Every element has its own key
 - Keys are not necessarily unique
- Total Order Relation
 - Denoted by \leq
 - **Reflexive:** $k \leq k$
 - **Antisymmetric:** if $k_1 \leq k_2$ and $k_2 \leq k_1$, then $k_1 \leq k_2$
 - **Transitive:** if $k_1 \leq k_2$ and $k_2 \leq k_3$, then $k_1 \leq k_3$
- A **Priority Queue** supports these fundamental methods on key-element pairs:
 - `min()`
 - `insertItem(k, e)`
 - `removeMin()`

Sorting with a Priority Queue

- A **Priority Queue** P can be used for sorting a sequence S by:
 - inserting the elements of S into P with a series of **insertItem**(e, e) operations
 - removing the elements from P in increasing order and putting them back into S with a series of **removeMin**() operations

Algorithm PriorityQueueSort(S, P):

Input: A sequence S storing n elements, on which a total order relation is defined, and a Priority Queue P that compares keys with the same relation

Output: The Sequence S sorted by the total order relation

```
while ! $S$ .isEmpty() do  
     $e \leftarrow S$ .removeFirst()  
     $P$ .insertItem( $e, e$ )  
while  $P$  is not empty do  
     $e \leftarrow P$ .removeMin()  
     $S$ .insertLast( $e$ )
```

The Priority Queue ADT

- A priority queue P supports the following methods:
 - `size()`:
Return the number of elements in P
 - `isEmpty()`:
Test whether P is empty
 - `insertItem(k, e)`:
Insert a new element e with key k into P
 - `minElement()`:
Return (but don't remove) an element of P with smallest key; an error occurs if P is empty.
 - `minKey()`:
Return the smallest key in P ; an error occurs if P is empty
 - `removeMin()`:
Remove from P and return an element with the smallest key; an error condition occurs if P is empty.

Comparators

- The most general and reusable form of a priority queue makes use of **comparator** objects.
- Comparator objects are external to the keys that are to be compared and compare two objects.
- When the priority queue needs to compare two keys, it uses the comparator it was given to do the comparison.
- Thus a priority queue can be general enough to store any object.
- The comparator ADT includes:
 - `isLessThan(a, b)`
 - `isLessThanOrEqualTo(a,b)`
 - `isEqualTo(a, b)`
 - `isGreaterThan(a,b)`
 - `isGreaterThanOrEqualTo(a,b)`
 - `isComparable(a)`

Implementation with an Unsorted Sequence

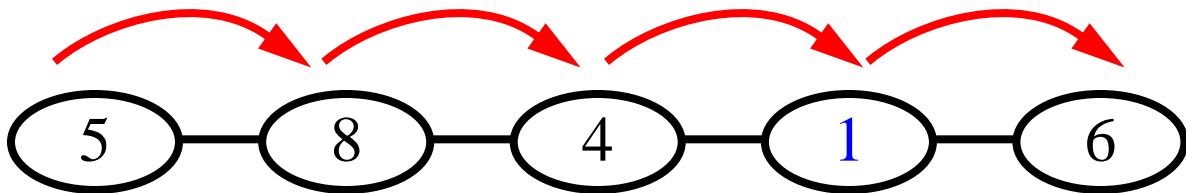
- Let's try to implement a priority queue with an unsorted sequence S .
- The elements of S are a composition of two elements, k , the key, and e , the element.
- We can implement `insertItem()` by using `insertLast()` on the sequence. This takes $O(1)$ time.



- However, because we always insert at the end, irrespectively of the key value, our sequence is not ordered.

Implementation with an Unsorted Sequence (contd.)

- Thus, for methods such as `minElement()`, `minKey()`, and `removeMin()`, we need to *look at all the elements* of S . The worst case time complexity for these methods is $O(n)$.



- Performance summary

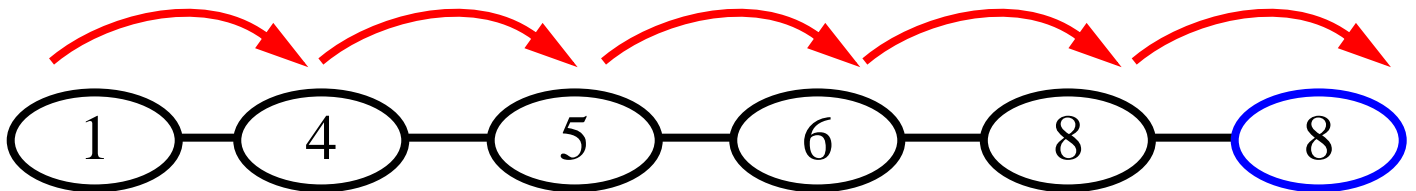
<i>insertItem</i>	$O(1)$
<i>minKey, minElement</i>	$O(n)$
<i>removeMin</i>	$O(n)$

Implementation with a Sorted Sequence

- Another implementation uses a sequence S , sorted by increasing keys
- `minElement()`, `minKey()`, and `removeMin()` take $O(1)$ time



- However, to implement `insertItem()`, we must now scan through the entire sequence *in the worst case*. Thus, `insertItem()` runs in $O(n)$ time



- Performance summary

<i>insertItem</i>	$O(n)$
<i>minKey, minElement</i>	$O(1)$
<i>removeMin</i>	$O(1)$

Implementation with a Sorted Sequence(contd.)

```
public class SequenceSimplePriorityQueue
implements SimplePriorityQueue {
    //Implementation of a priority queue
    using a sorted sequence
    protected Sequence seq = new NodeSequence();
    protected Comparator comp;

    // auxiliary methods
    protected Object key (Position pos) {
        return ((Item)pos.element()).key();
    } // note casting here

    protected Object element (Position pos) {
        return ((Item)pos.element()).element();
    } // casting here too

    // methods of the SimplePriorityQueue ADT
    public SequenceSimplePriorityQueue (Comparator c) {
        comp = c; }
    public int size () {return seq.size(); }
```

...Continued on next page...

Implementation with a Sorted Sequence(contd.)

```
public void insertItem (Object k, Object e) throws
InvalidKeyException {
    if (!comp.isComparable(k)) {
        throw new InvalidKeyException("The key is not valid");
    }
    else {
        if (seq.isEmpty()) {
            //if the sequence is empty, this is the
            seq.insertFirst(new Item(k,e)); //first item
        }
        else { //check if it fits right at the end
            if (comp.isGreaterThan(k, key(seq.last()))) {
                seq.insertAfter(seq.last(), new Item(k,e));
            }
            else {
                //we have to find the right place for k.
                Position curr = seq.first();
                while (comp.isGreaterThan(k, key(curr))) {
                    curr = seq.after(curr);
                }
                seq.insertBefore(curr, new Item(k,e));
            }
        }
    }
}
```

...Continued...

Implementation with a Sorted Sequence(contd.)

```
public Object minElement () throws
EmptyContainerException {
    if (seq.isEmpty()) {
        throw new EmptyContainerException("The priority
        queue is empty");
    }
    else {
        return element(seq.first());
    }
}

public boolean isEmpty () {
    return seq.isEmpty();
}
}
```

Selection Sort

- Selection Sort is a variation of PriorityQueueSort that uses an *unsorted sequence* to implement the priority queue P .
- **Phase 1**, the insertion of an item into P takes $O(1)$ time
- **Phase 2**, removing an item from P takes time proportional to the current number of elements in P

	Sequence S	Priority Queue P
Input	(7, 4, 8, 2, 5, 3, 9)	()
Phase 1:		
(a)	(4, 8, 2, 5, 3, 9)	(7)
(b)	(8, 2, 5, 3, 9)	(7, 4)
...
(g)	()	(7, 4, 8, 2, 5, 3, 9)
Phase 2:		
(a)	(2)	(7, 4, 8, 5, 3, 9)
(b)	(2, 3)	(7, 4, 8, 5, 9)
(c)	(2, 3, 4)	(7, 8, 5, 9)
(d)	(2, 3, 4, 5)	(7, 8, 9)
(e)	(2, 3, 4, 5, 7)	(8, 9)
(f)	(2, 3, 4, 5, 7, 8)	(9)
(g)	(2, 3, 4, 5, 7, 8, 9)	()

Selection Sort (cont.)

- As you can tell, a bottleneck occurs in Phase 2. The first removeMinElement operation take $O(n)$, the second $O(n-1)$, etc. until the last removal takes only $O(1)$ time.
- The total time needed for phase 2 is:

$$O(n + (n - 1) + \dots + 2 + 1) \equiv O\left(\sum_{i=1}^n i\right)$$

- By a well-known fact:

$$\sum_{i=1}^n i = \frac{n(n+1)}{2}$$

- The total time complexity of phase 2 is then $O(n^2)$. Thus, the time complexity of the algorithm is $O(n^2)$.

Insertion Sort

- Insertion sort is the sort that results when we perform a PriorityQueueSort implementing the priority queue with a *sorted sequence*.

	Sequence S	Priority Queue P
Input	(7, 4, 8, 2, 5, 3, 9)	()
Phase 1:		
(a)	(4, 8, 2, 5, 3, 9)	(7)
(b)	(8, 2, 5, 3, 9)	(4, 7)
(c)	(2, 5, 3, 9)	(4, 7, 8)
(d)	(5, 3, 9)	(2, 4, 7, 8)
(e)	(3, 9)	(2, 4, 5, 7, 8)
(f)	(9)	(2, 3, 4, 5, 7, 8)
(g)	()	(2, 3, 4, 5, 7, 8, 9)
Phase 2:		
(a)	(2)	(3, 4, 5, 7, 8, 9)
(b)	(2, 3)	(4, 5, 7, 8, 9)
...
(g)	(2, 3, 4, 5, 7, 8, 9)	()

Insertion Sort(cont.)

- We improve phase 2 to $O(n)$.
- However, phase 1 now becomes the bottleneck for the running time. The first **insertItem** takes $O(1)$ time, the second one $O(2)$, until the last operation takes $O(n)$ time, for a total of $O(n^2)$ time
- Selection-sort and insertion-sort both take $O(n^2)$ time
- Selection-sort will **always** executes a number of operations proportional to n^2 , no matter what is the input sequence.
- The running time of insertion sort varies depending on the input sequence.
- Neither is a good sorting method, except for small sequences
- We have yet to see the ultimate priority queue....

Sorting

- By now, you've seen a little bit of sorting, so let us tell you a little more about it.
- Sorting is essential because efficient *searching* in a database can be performed only if the records are sorted
- It is estimated that about 20% of all the computing time worldwide is devoted to sorting
- We shall see that there is a trade-off between the “simplicity” and efficiency of sorting algorithms:
- The elementary sorting algorithms you've just seen, though easy to understand and implement, take $O(n^2)$ time (unusable for large values of n)
- more sophisticated algorithms take $O(n \log n)$ time
- Comparison of Keys: *do we base comparison upon the entire key or upon parts of the key?*
- Space Efficiency: *in-place sorting vs. use of auxiliary structures*
- Stability: *a stable sorting algorithm preserves the initial relative order of equal keys*