

## COS 460 – Algorithms (week 05)

### Sorting Algorithms. Quick Sort. Priority Queue.

Writing robust sorting functions that can sort any type of data into sorted order using the data type's natural order.

- Client passes array of objects to sorting routine.
- Sorting routine calls object's comparison function as needed.

**Consistency.** It is the programmer's responsibility to ensure that the comparison function specifies a **total order**.

- Transitivity: if  $a < b$  and  $b < c$ , then  $a < c$ .
- Trichotomy: either (i)  $a < b$  or (ii)  $b < a$  or (iii)  $a = b$ .

Built-in comparable types: `int`, `double`, `char`, `string`, `bool`.

User-defined comparable types. Implementation of the comparable interface. Example:

```
#include<string>
#include<iostream>
using namespace std;

struct date
{
    int month, day, year;
    date(){};
    date(int m, int d, int y)
    {
        month = m;
        day = d;
        year = y;
    }
    bool cmp(date b)
    {
        if (year < b.year ) return true;
        if (year > b.year ) return false;
        if (month < b.month) return true;
        if (month > b.month) return false;
        if (day < b.day ) return true;
        if (day > b.day ) return false;
        return false;
    }
};
/*
bool cmp(date a, date b)
{
    if (a.year < b.year) return true;
    if (a.year > b.year) return false;
    if (a.month < b.month) return true;
    if (a.month > b.month) return false;
    if (a.day < b.day) return true;
    if (a.day > b.day) return false;
    return false;
}
*/
```

```

template<class T>
bool operator < (T a, T b)
{
    return a.cmp(b);
}

int main()
{
    date a(1,1,2007), b(2,1,2007);
    cout << (a<b)<<endl;
    int c=3, d=4;
    cout << (c<d)<<endl;
    system("pause");
}

```

## Elementary Sorting Methods

### Insertion sort.

- Scans from left to right by moving the position  $i$ .
- Element to right of  $i$  are not touched.
- Invariant: elements to the left of  $i$  are in ascending order.
- Inner loop: repeatedly swap element  $i$  with element to its left.

For each  $i$  from 2 to  $N$ , the elements  $a[1], \dots, a[i]$  are sorted by putting  $a[i]$  into position among the sorted list of elements in  $a[1], \dots, a[i-1]$ .

```

void InsertionSort(T a[], int N)
{
    for(int i=2; i<=N; i++)
    { T v=a[i]; int j=i;
      while(a[j-1]>v) {a[j]=a[j-1]; j--;}
      a[j]=v;
    }
}

```

S	O	R	T	E	X	A	M	P	L	E					
O	S	R	T	E	X	A	M	P	L	E					
O	R	S	T	E	X	A	M	P	L	E					
E	O	R	S	T	E	X	A	M	P	L	E				
E	O	R	S	T	X	A	M	P	L	E					
A	E	O	R	S	T	X	A	M	P	L	E				
A	E	M	O	R	S	T	X	A	M	P	L	E			
A	E	M	O	P	R	S	T	X	A	M	P	L	E		
A	E	L	M	O	P	R	S	T	X	A	M	P	L	E	
A	E	E	L	M	O	P	R	S	T	X	A	M	P	L	E

*Insertion sort example*

*Insertion sort example*

### Selection sort.

- Moving position  $i$  scans from left to right.
- Elements to the left of  $i$  are fixed and in ascending order.
- No element to left of  $i$  is larger than any element to its right.

The method works by repeatedly “selecting” the smallest remaining element and puts it at the last position of the sorted part.

```

void SelectionSort(T a[], int N)
{
    for(int i=1; i < N; i++)
    { int min=i;
      for(int j=i+1; j<= N; j++)
          if(a[j] < a[min]) min=j;
      swap(a[i], a[min]);
    }
}

```

S	O	R	T	E	X	A	M	P	L	E
S	O	R	T	E	X	A	M	P	L	E
A	O	R	T	E	X	S	M	P	L	E
A	E	R	T	O	X	S	M	P	L	E
A	E	E	T	O	X	S	M	P	L	R
A	E	E	L	O	X	S	M	P	T	R
A	E	E	L	M	X	S	O	P	T	R
A	E	E	L	M	O	S	X	P	T	R
A	E	E	L	M	O	P	X	S	T	R
A	E	E	L	M	O	P	R	S	T	X
A	E	E	L	M	O	P	R	S	T	X
A	E	E	L	M	O	P	R	S	T	X

*Selection sort example*

**Digression: Bubble Sort.** An elementary sorting method that is often taught in introductory classes: keep passing through the sequence, exchanging adjacent elements, if necessary; when no exchanges are required on some pass, the data are sorted.

```
void BubbleSort(T a[], int N)
{
    for(int i = N; i >= 1; i--)
        for(int j = 2; j <= i; j++)
            if(a[j-1] > a[j]) swap(a[j-1], a[j]);
}
```

### Performance characteristics of elementary sorts

**Property 1.** Selection sort uses about  $N^2/2$  comparisons and  $N$  exchanges.

**Property 2.** Insertion sort uses about  $N^2/4$  comparisons and  $N^2/8$  exchanges on the average, twice as many in the worst case.

**Property 3.** Bubble sort uses about  $N^2/2$  comparisons and  $N^2/2$  exchanges on the average and in the worst case

**Property 4.** Insertion sort is linear for “almost sorted” data.

### Sorting files with large records

It is desirable to arrange elements so that **any** sorting method uses only  $N$  “exchanges” of full records, by having the algorithm operate indirectly on the file (using an array of indices) and then do the rearrangement afterwards.

Specifically, if the array  $a[1], \dots, a[N]$  consists of large records, then we prefer to manipulate an index array  $p[1], \dots, p[N]$  accessing the original array only for comparisons. If we define  $p[i]=i$  initially, many sorting algorithms need only be modified to refer to  $a[p[i]]$  rather than  $a[i]$  when using  $a[i]$  in a comparison, and to refer to  $p$  rather than  $a$  when doing data movement. This produces an algorithm that will sort the index array so that  $p[1]$  is the index of the smallest element in  $a$ , and so on. The cost of moving large records is avoided.

```
void InsertionSort_LargeRecords(T a[], int N, int p[])
{
    for(int i=0; i <= N; i++) p[i]=i;
    for(int i=2; i<=N; i++)
    { int v=p[i]; int j=i;
      while(a[p[j-1]]>a[v]) {p[j]=p[j-1]; j--;}
      p[j]=v;
    }
}
```

### Distribution Counting

A very special situation for which there is a simple sorting algorithm is the following: “sort a file of  $N$  records whose keys are distinct integers between 1 and  $N$ ”. Using a temporary array  $b$ :

```
for(int i=1; i<=N; i++) b[a[i]] = a[i];
for(int i=1; i<=N; i++) a[i] = b[i];
```

**Exercise:** Solve this problem without an auxiliary array.

A more realistic example: “sort a file of  $N$  records whose keys are integers between 0 and  $M-1$ ”. If  $M$  is not too large, we may use an array  $c$  for *distribution counting*:

```
for(int j=0; j<M; j++) c[j]=0;
for(int i=1; i<=N; i++) c[a[i]]++;
for(int j=1; j<M; j++) c[j] += c[j-1];
for(int i=N; i>=1; i--) b[c[a[i]]--]=a[i];
for(int i=1; i<=N; i++) a[i] = b[i];
```

## Mergesort and Quicksort: Two great sorting algorithms

### Mergesort:

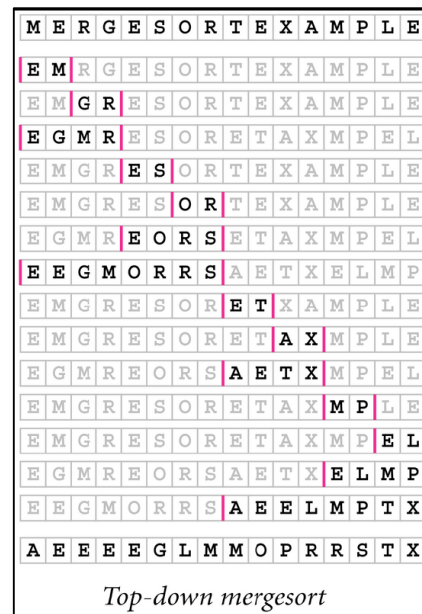
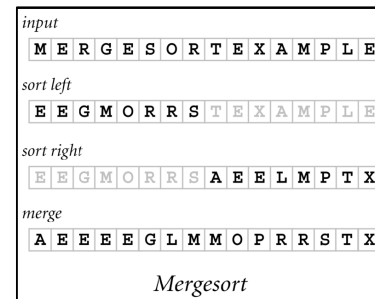
- Divide array into two halves.
- Recursively sort each half.
- Merge two halves to make sorted whole.

```
void merge(int a[],
           int beg, int mid, int end)
{ int n = end - beg + 1;
  int b[n];
  int i1 = beg;
  int i2 = mid + 1;
  int j = 0;
  while ((i1 <= mid) && (i2 <= end))
  { if (a[i1] < a[i2])
    { b[j]=a[i1]; i1++; }
    else { b[j]=a[i2]; i2++; }
    j++;
  }
  while(i1 <= mid)
  { b[j]=a[i1]; i1++; j++; }
  while(i2 <= end)
  { b[j]=a[i2]; i2++; j++; }
  for(j=0; j<n; j++) a[beg+j] = b[j];
}
```

### Example run:

```
int a[] =
{5, 9, 10, 12, 17, 8, 11, 20, 32};
merge(a, 0, 4, 8);
```

```
(5,9,10,12,17)(8,11,20,32) ⇒ (1)
(9,10,12,17)(8,11,20,32) ⇒ (1,5)
(9,10,12,17)(11,20,32) ⇒ (1,5,8)
(10,12,17)(11,20,32) ⇒ (1,5,8,9)
(12,17)(11,20,32) ⇒ (1,5,8,9,10)
(12,17)(20,32) ⇒ (1,5,8,9,10,11)
(17)(20,32) ⇒ (1,5,8,9,10,11,12)
()(20,32) ⇒ (1,5,8,9,10,11,12,17)
()(32) ⇒ (1,5,8,9,10,11,12,17,20)
()() ⇒ (1,5,8,9,10,11,12,17,20,32)
```



## Merge Sort: Complete sorting program:

```
void merge_sort(int a[],int beg, int end)
{ if (beg == end) return;
  int mid = (beg + end) / 2;
  merge_sort(a, beg, mid);
  merge_sort(a, mid + 1, end);
  merge(a, beg, mid, end);
}
```

## Mergesort Analysis: Memory

How much memory does mergesort require?

- Original input array = N.
- Auxiliary array for merging = N.
- Local variables: constant.
- Function call stack:  $\log_2 N$ .
- Total =  $2N + O(\log N)$ .

How much memory do other sorting algorithms require?

- $N + O(1)$  for insertion sort and selection sort.
- In-place =  $N + O(\log N)$ .

Challenge for the bored. In-place merge.

## Mergesort Analysis: Running Time

Def.  $T(N)$  = number of comparisons to mergesort an input of size N.

Mergesort recurrence.

$$T(N) \leq \begin{cases} 0 & \text{if } N = 1 \\ \underbrace{T(\lceil N/2 \rceil)}_{\text{solve left half}} + \underbrace{T(\lfloor N/2 \rfloor)}_{\text{solve right half}} + \underbrace{N}_{\text{merging}} & \text{otherwise} \end{cases}$$

Solution.  $T(N) = O(N \log_2 N)$ .

Note: same number of comparisons for any input of size N.

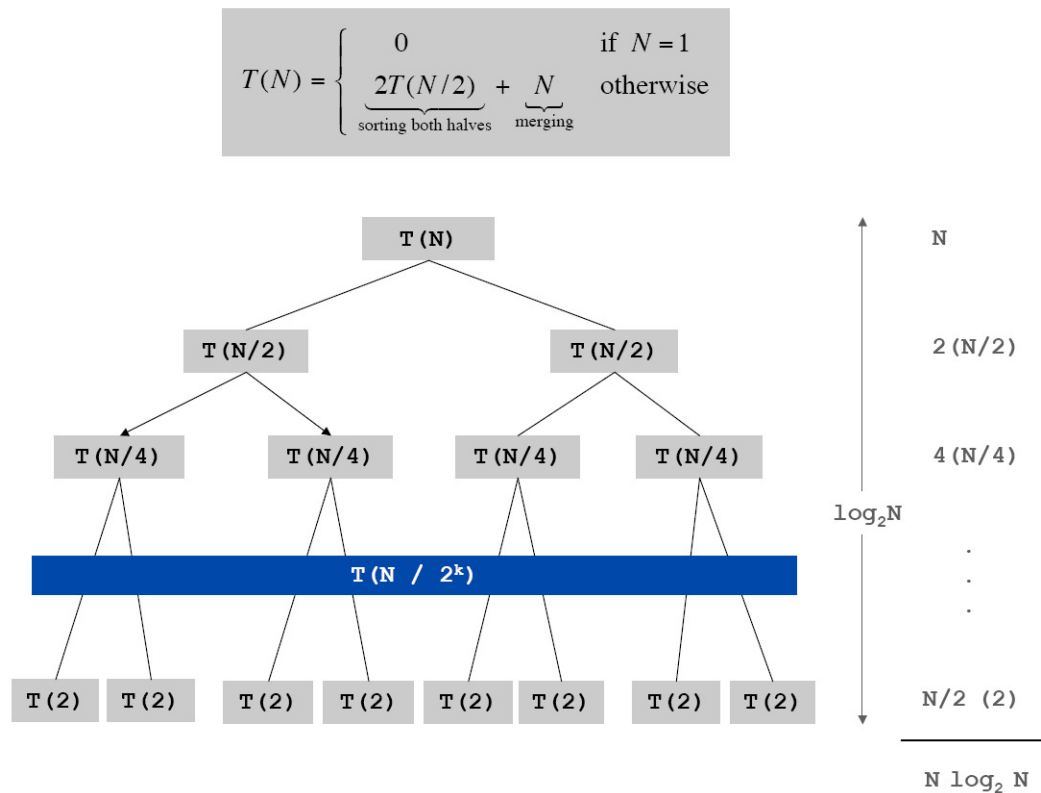
We prove  $T(N) = N \log_2 N$  when N is a power of 2, and  $=$  instead of  $\leq$ .

Proof by Induction

- Base case:  $n = 1$ .
- Inductive hypothesis:  $T(n) = n \log_2 n$ .
- Goal: show that  $T(2n) = 2n \log_2 (2n)$ .

$$\begin{aligned} T(2n) &= 2T(n) + 2n \\ &= 2n \log_2 n + 2n \\ &= 2n(\log_2(2n) - 1) + 2n \\ &= 2n \log_2(2n) \end{aligned}$$

## Proof by Recursion Tree



Good algorithms are better than supercomputers .

Home PC executes  $10^8$  comparisons/second. Supercomputer executes  $10^{12}$  comparisons/second.

Insertion Sort ( $N^2$ )

computer	thousand	million	billion
home	instant	2.8 hours	317 years
super	instant	1 second	1.6 weeks

Mergesort ( $N \log N$ )

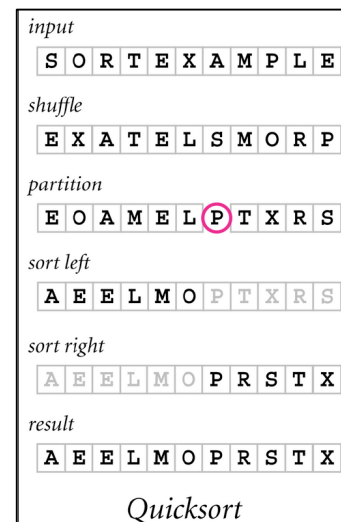
thousand	million	billion
instant	1 sec	18 min
instant	instant	instant

## QuickSort

- Shuffle the array.
- Partition array so that:
  - element  $a[i]$  is in its final place for some  $i$
  - no larger element to the left of  $i$
  - no smaller element to the right of  $i$
- Sort each piece recursively.

The basic algorithm

```
void quicksort(T a[], int L, int R)
{ if(L<R)
  {int p = partition(a,L,R);
   quicksort(a,L,p-1);
   quicksort(a,p+1,R);
  }
}
```



```

int partition(T a[], int L, int R)
{
    T v=a[R]; int i=L-1; int j=R;
    while(1)
    {
        while(a[++i]<v);
        while(a[--j]>v);
        if(i>=j) break;
        swap(a[i],a[j]);
    }
    swap(a[i],a[R]);
    return i;
}

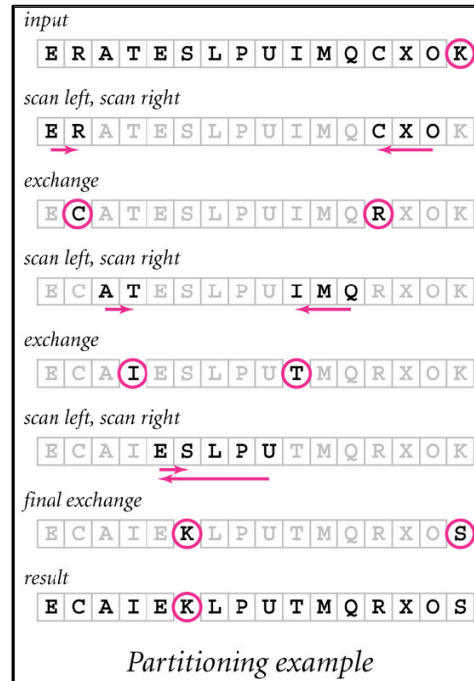
```

### Quick Sort Algorithm (another implementation):

```

void qsort(int a[], int L, int R)
{
    int i=L, j=R;
    int x=a[(i + j)/2];
    do
    {
        while (a[i] < x) i++;
        while (a[j] > x) j--;
        if (i <= j)
        {
            swap(a[i], a[j]); i++; j--;
        }
    } while (i <= j);
    if (L < j) qsort(a, L, j);
    if (i < R) qsort(a, i, R);
}

```



### Quicksort: Performance Characteristics

Worst case. Number of comparisons is quadratic.

- $N + (N-1) + (N-2) + \dots + 1 \approx N^2 / 2$ .
- More likely that your computer is struck by lightning.

Caveat. Many textbook implementations go quadratic if input:

- Is sorted.
- Is reverse sorted.
- Has many duplicates.

### Quicksort: Average Case

Average case running time.

- Roughly  $2 N \ln N$  comparisons.
- Assumption: file is randomly shuffled.

Remarks.

- 39% more comparisons than mergesort.
- Faster than mergesort in practice because of lower cost of other high-frequency instructions.
- Caveat: many textbook implementations have best case  $N^2$  if duplicates, even if randomized!

Theorem. The average number of comparisons  $C_N$  to quicksort a random file of  $N$  elements is about  $2N \ln N$ .

The precise recurrence satisfies  $C_0 = C_1 = 0$  and for  $N \geq 2$ :

$$\begin{aligned}
C_N &= N + 1 + \frac{1}{N} \sum_{k=1}^N (C_k + C_{N-k}) \\
&= N + 1 + \frac{2}{N} \sum_{k=1}^N C_{k-1}
\end{aligned}$$

Multiply both sides by N and subtract the same formula for N-1:

$$NC_N - (N-1)C_{N-1} = N(N+1) - (N-1)N + 2C_{N-1}$$

Simplify to:

$$NC_N = (N+1)C_{N-1} + 2N$$

Divide both sides by N(N+1) to get a telescoping sum:

$$\begin{aligned}
\frac{C_N}{N+1} &= \frac{C_{N-1}}{N} + \frac{2}{N+1} \\
&= \frac{C_{N-2}}{N-1} + \frac{2}{N} + \frac{2}{N+1} \\
&= \frac{C_{N-3}}{N-2} + \frac{2}{N-1} + \frac{2}{N} + \frac{2}{N+1} \\
&= \vdots \\
&= \frac{C_2}{3} + \sum_{k=3}^N \frac{2}{k+1}
\end{aligned}$$

Approximate the exact answer by an integral:

$$\frac{C_N}{N+1} \approx \sum_{k=1}^N \frac{2}{k} \approx \int_{k=1}^N \frac{2}{k} = 2 \ln N$$

Finally, the desired result:

$$C_N \approx 2(N+1) \ln N \approx 1.39N \log_2 N. \quad \blacksquare$$

### Comparison Based Sorting Lower Bound

Theorem. Any comparison based sorting algorithm must use  $\Omega(N \log_2 N)$  comparisons.

Proof.

- Suffices to establish lower bound when input consists of N distinct values  $a_1$  through  $a_N$ .
- Worst case dictated by tree height h.
- N ! different orderings.
- (At least) one leaf corresponds to each ordering.
- Binary tree with N ! leaves must have height (Stirling formula):

$$\begin{aligned}
h &\geq \log_2(N!) \\
&\geq \log_2(N/e)^N \\
&= N \log_2 N - N \log_2 e.
\end{aligned}$$



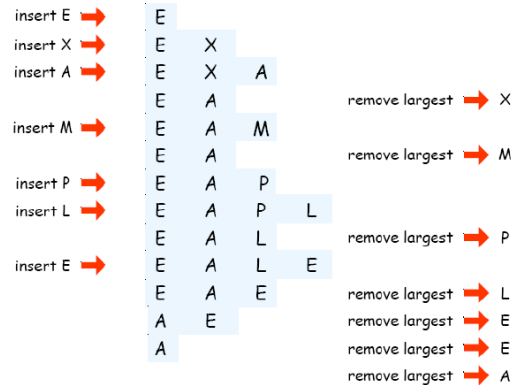
## Priority Queue:

Generalizes: stack, queue, randomized queue.

**Data.** Items that can be compared.

### Basic operations.

- Insert.
  - Remove largest.
- } defining ops
- 
- Copy.
  - Create.
  - Destroy.
  - Test if empty.
- } generic ops



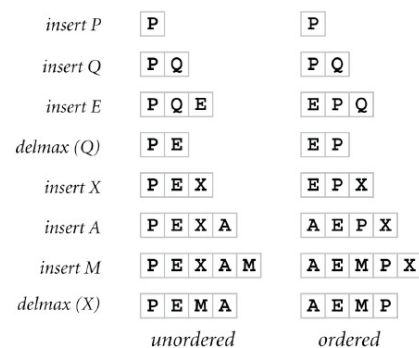
### Applications.

- Event-driven simulation. [customers in a line, colliding particles]
- Numerical computation. [reducing roundoff error]
- Data compression. [Huffman codes]
- Graph searching. [Dijkstra's algorithm, Prim's algorithm]
- Computational number theory. [sum of powers]
- Artificial intelligence. [A\* search]
- Statistics. [maintain largest M values in a sequence]
- Operating systems. [load balancing, interrupt handling]
- Discrete optimization. [bin packing, scheduling]
- Spam filtering. [Bayesian spam filter]

### Two elementary implementations.

Implementation	Insert	Del Max
unordered array	1	N
ordered array	N	1

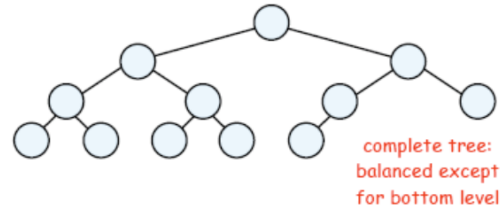
worst-case asymptotic costs for PQ with N items



**Heap:** Array representation of a heap-ordered complete binary tree.

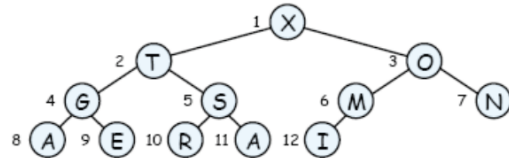
**Binary tree.**

- Empty **or**
- Node with links to left and right trees.



**Heap-ordered binary tree.**

- Keys in nodes.
- No smaller than children's keys.

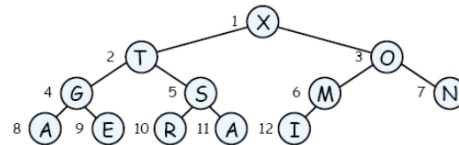


**Array representation.**

- Take nodes in **level** order.
- No explicit links needed since tree is complete.

1	2	3	4	5	6	7	8	9	10	11	12
X	T	O	G	S	M	N	A	E	R	A	I

**Property A.** Largest key is at root.



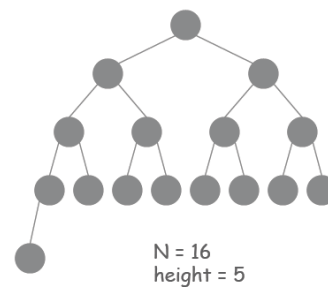
**Property B.** Can use array indices to move through tree.

- Note: indices start at 1.
- Parent of node at  $k$  is at  $k/2$ .
- Children of node at  $k$  are at  $2k$  and  $2k+1$ .

1	2	3	4	5	6	7	8	9	10	11	12
X	T	O	G	S	M	N	A	E	R	A	I

**Property C.** Height of  $N$  node heap is  $1 + \lceil \lg N \rceil$ .

height only increases when  $N$  is a power of 2



## Priority queue

A simple implementation of a Priority queue using an array:

<pre> class pq { private:     int n;     int a[100]; public:     pq(int v)     { n=1;       a[1]=v;     }     int size(){return n;}     void add(int v)     {         n++;         a[n]=v;         int p=n;         while(p/2&gt;0)         {             if(a[p] &lt;= a[p/2]) return;             if(p%2==0) if(p+1&gt;n)                 {a[p]=a[p/2]; a[p/2]=v; p=p/2;                  continue;}             p=2*(p/2);             if(a[p+1]&gt;a[p])                 {a[p+1]=a[p/2]; a[p/2]=v; p=p/2;}             else                 {a[p]=a[p/2]; a[p/2]=v; p=p/2;}         }     } } </pre>	<pre> int get() { int w=a[1];   int v=a[n];   n--;   a[1]=v;   int p=1;   while(1)   {       if(2*p&gt;n) break;       if(2*p+1&gt;n)           {if(a[p]&lt;a[2*p])              {a[p]=a[2*p]; a[2*p]=v;}            break;}       if((a[p]&gt;a[2*p])&amp;&amp;(a[p]&gt;a[2*p+1]))           break;       if(a[2*p]&gt;a[2*p+1])           {a[p]=a[2*p]; a[2*p]=v; p=2*p;}       else           {a[p]=a[2*p+1]; a[2*p+1]=v;            p=2*p+1;}   }   return w; } </pre>
--	--

Operation	Insert	Remove Max	Find Max
ordered array	N	1	1
ordered list	N	1	1
unordered array	1	N	N
unordered list	1	N	N
binary heap	lg N	lg N	1

worst-case asymptotic costs for PQ with N items

### Exercises:

1. Write a complete program to test the implementation of a Priority queue ADT.
2. Write a member function like `get()`, but that only returns the element, not to remove it.
3. What is the complexity of `add()` and `get()` functions?
4. Write a universal implementation of a Priority queue – replace data field `int` with a class.
5. Write a universal implementation of a Priority queue – replace ordering relation “`<=`” with an arbitrary function that has property of “order”.
6. Write *naive* implementation of a Priority queue with  $O(n)$  complexity of `add()` and/or `get()` functions.
7. Write a function to sort a sequence of data using Priority queue ADT.
8. Find the complexity of the above sorting algorithm.
9. Make a study of STL `priority_queue` Class.

**STL example:**

```
#include<iostream>
#include<queue>
using namespace std;

struct data
{string s; double b; int r;};
struct cmp:
public binary_function<data, data, bool>
{ bool operator()(data x, data y)
  {if(x.b < y.b) return true;
   if(x.b==y.b) if(x.r > y.r) return true;
   return false;
  }
};
priority_queue<data, vector<data>, cmp> Q;
int main()
{int c=0;
 int n; cin >> n;
 for(int i=1;i<=n;i++)
 { int m; cin >> m;
  for(int j=1;j<=m;j++)
  { data d;
   cin >> d.s >> d.b;
   d.r=c; c++;
   Q.push(d);
  }
  int k; cin >> k;
  for(int j=1; j<=k; j++) Q.pop();
 }
 cout << (Q.top()).s << endl;
}
```