### **Brute Force**

- Directly do the problem without worrying about costs
- Sometimes simple strategy (as in sorting below)
- Advantage:
  - Simple,
  - general,
  - usually good enough for small input size
- Disadvantage
  - Often takes too much time.

### **Brute Force**

- Selection sort
- Bubble sort
- Sequential Search
- String Matching
- Closest Pair, Convex Hull
- Exhaustive Search

## **Selection Sort**

- Numbers which are already in right position p
- Numbers which are yet to be sorted s = n p
- Find the smallest of the s numbers, and put it in the right place.
- Initially, p = 0, s = n.

## **Selection Sort**

```
Selection Sort
    Input: array A[0:n-1]
    For i \leftarrow 0 to n-2 do
         minloc \leftarrow i
         For j \leftarrow i + 1 to n - 1 do
                If A[j] < A[minloc], then minloc \leftarrow j
         EndFor
         (* Swap A[i] and A[minloc]. *)
         temp \leftarrow A[i], A[i] = A[minloc], A[minloc] = temp.
    EndFor
End
```

- | 21 29 23 19
- 19 | 29 23 21
- 19 21 | 23 29
- 19 21 23 | 29
- 19 21 23 29

# **Analysis**

- Consider C(n), number of comparisons.
- In iteration i, takes n-1-i comparisons.

• 
$$C(n) = \sum_{i=0}^{i=n-2} \sum_{j=i+1}^{j=n-1} 1$$

$$= \sum_{i=0}^{i=n-2} n - 1 - i = n(n-1)/2 \in \Theta(n^2)$$

- So complexity is  $O(n^2)$  (in fact it is  $\Theta(n^2)$ )
- For all, average, best, worst
- Space: In place (plus constant).
- Not stable (consider sorting for 5 5 2)
- Stable sorting algorithms maintain relative order for equal numbers.

## **Bubble Sort**

- Swap pairwise elements which are out of order, from beginning to end.
- In each round at least one more element is in rightful place (last i elements after i rounds)
- Stable

## **Bubble Sort**

```
Bubble Sort Input: A[0..n-1] For i\leftarrow 0 to n-2 do For j\leftarrow 0 to n-2-i do If A[j]>A[j+1], then swap A[j] and A[j+1]. EndFor EndFor
```

54	$\overset{?}{\longleftrightarrow}$	43		69		34
43		54	$\overset{?}{\leftrightarrow}$	69		34
43		54		69	$\overset{?}{\longleftrightarrow}$	34
43		54		34		69

# **Analysis**

• In iteration i, takes n-1-i comparisons.

• 
$$C(n) = \sum_{i=0}^{i=n-2} \sum_{j=i+1}^{j=n-1} 1$$

$$= \sum_{i=0}^{i=n-2} n - 1 - i = n(n-1)/2 \in \Theta(n^2)$$

In place and Stable

## **Insertion Sort**

- Array A[1:n] given
- Progressively, insert the i-th element of the array into A[1:i-1], which is already sorted.

#### Example:

```
5, 3, 7, 9, 2, 6
5, 3, 7, 9, 2, 6
```

## **Insertion Sort**

```
Input: A[1:n].

Output: Sorted array in increasing order.
```

```
Insertion Sort
1. For i = 2 to n \{
   2. Let temp = A[i]
   3. Let j = i - 1
   4. While j \ge 1 and A[j] > temp Do {
             A[j+1] = A[j]
             j = j - 1
  \{A[j+1] = temp.
```

In the iteration of the For loop at step 1, for a particular value of *i*:

- (a) just before the start of the iteration:  $A[1], \ldots, A[i-1]$  are in increasing order,
- (b) during the iteration: A[i] is placed in its correct position.
- (c) at the end of the iteration:  $A[1], \ldots, A[i]$  are in increasing order.

(b): In each iteration of the For loop:

The while loop: "shifts" the numbers greater than A[i] to the right.

Then places A[i] in its correct place.

#### Complexity:

Number of comparisons/operations:

Best Case: O(n)

(happens when the numbers are already in increasing order).

The while loop condition is never true, and thus the algorithm takes a constant amount of time in each iteration of the for loop.

#### Worst Case:

For the iteration of the For-Loop for a particular value of *i*:

The while loop is executed at most i-1 times. (\* happens for example when the numbers are in reverse sorted order \*)

Thus, the whole while loop takes time at most  $c_1 * i$ Thus, the for loop iteration for a particular i takes time  $\leq c_2 * i$ .

Therefore the whole algorithm takes time at most:

$$c_2(2+3+4+5\ldots+n) \le c_2 * n^2$$
.

#### Another method to analyze:

$$T(n) \le C * n + T(n-1).$$

This gives, 
$$T(n) \le C * (n + n - 1 + ...) \le C * n^2 = O(n^2)$$
.

- ightharpoonup T(particular input) = ?
- Size of input
- Worst Case T(n), for a particular size n of input: max { T(input): input has size n}
- Best Case T(n) min { T(input): input has size n}
- Average Case T(n)

 $\frac{\sum\{ T(input): input has size n \}}{number of inputs of size n}$ 

- Sometimes Average Case is with probability over different inputs of size n.
- Asymptotic Bounds, are over "all n". Gives good estimate for large enough  $n, \ldots$ ,

# **Sequential Search**

```
Sequential Search
Input A[0:n-1], Use A[n] as sentinel
Target key: K
A[n] \leftarrow K.
   i \leftarrow 0
   While A[i] \neq K do
        i = i + 1
   EndWhile
   If i < n, then "Found" at i.
   Else, "not found"
End
```

Complexity: C(n) = n + 1 for not found. For found, Best case 1, Worst Case n.

# **String Matching**

```
Input: A[0:n-1] (string)
Input: P[0:m-1] (pattern)
For i\leftarrow 0 to n-m
Found=True
For j\leftarrow 0 to m-1
If A[i+j]\neq P[j], Then Found=False; break
EndFor
If Found, then Location is i; break
EndFor
```

- String: THE BIG BROWN FOR JUMPED RIGHT OVER THE LAZY DOG
- Pattern: BROWN
- Complexity  $C(n) \leq (n-m+1)m \in O(mn)$ .
- Worst case is actually  $C(n) = \Theta(mn)$ .
- For random text, the average case is linear  $\Theta(n)$  (proof not for this class).

### **Closest Pair**

- ullet A set of points n points in m-dimensional space
- Find the closest pair of points.
- $P_i = (x[i,0], x[i,1], x[i,3], \dots, x[i,m-1]).$
- $d(P_i, P_j) = \sqrt{(x[i, 0] x[j, 0])^2 + \dots (x[i, m-1] x[j, m-1])^2}$
- Consider all possible pairs (i, j), with i < j.

```
Closest Pair Input: x[0:n-1,0:m-1] dmin=\infty For i\leftarrow 0 to n-2 do For j\leftarrow i+1 to n-1 do d=(x[i,0]-x[j,0])^2+(x[i,1]-x[j,1])^2+\dots(x[i,m-1]-x[j,m-1])^2 If d< dmin, then dmin=d, i_1=i,i_2=j. EndFor EndFor
```

minimal distance in  $\sqrt{dmin}$  and  $i_1, i_2$  is the minimal distance pair.

End

Complexity: The algorithm does  $\Theta(n^2)$  distance calculations — between each pair of points.

Each distance calculation takes  $\Theta(m)$  time.

Therefore,  $C(n) = \Theta(n^2m)$ .

## **Convex Hull**

- A shape S is convex if for any points P,Q in the shape, every point in the line joining P and Q is also in S. That is, for all  $\lambda$  with  $0 \le \lambda \le 1$ :  $\lambda P + (1 \lambda)Q \in S$ .
- Convex Hull of a set of points (at least three). Smallest convex shape S which contains the points. That is, for all convex S' which contain the points,  $S \subseteq S'$ .
- Theorem: For any finite set of points, Convex Hull is a convex polygon, and its vertices are included in the set of points given
- Hence, we just need to find the extreme pairs of points. The polygon formed using the line segments joining these pair of points will give the convex hull.

- Extreme: All other points are on the same side of the line joint the pair of points.
- For ease, we assume no triplets of points are colinear (at least not in the boundary of the convex hull).

## Convex Hull Input: A set Output: A co

Input: A set of n Points P[0:n-1]

Output: A convex hull for the set of points

For  $i \leftarrow 0$  to n-2 do

For  $j \leftarrow i+1$  to n-1 do

Find the equation of the line passing through P(i) and P(j)

Find the "distance" of P(k) from the line found above for all  $k \in \{0, 1, 2, \dots, n-1\} - \{i, j\}$ 

If all are positive or all are negative, then include the line segment (P(i), P(j)) in the convex hull.

(\* If only points of convex hull are needed, then include the points P(i) and P(j) \*)

EndFor EndFor

• Line passing through  $(x_1, y_1), (x_2, y_2)$ .

$$(y-y_1) = \frac{(y_2-y_1)}{x_2-x_1}(x-x_1)$$
.

- Rearrange to put it in form ax + by + c = 0.
- Distance of a point  $(x_0, y_0)$  from a line ax + by + c = 0 is given by  $\frac{ax_0 + by_0 + c}{\sqrt{a^2 + b^2}}$
- Count the number of times line equation is evaluated, and distance is calculated.
- Number of times line equation is evaluated: n(n-1)/2.
- Number of times distance is evaluated n(n-1)(n-2)/2.
- $C(n) \in \Theta(n^3).$

## **Exhaustive Search**

Generate all possible solutions and choose the correct/best among them

## Travelling Salesman Problem

- Input a weighted graph G = (V, E) (undirected)
- Find a simple circuit which goes through all the vertices and has minimum weight.
- Brute Force/Exhaustive approach: For each possible order of the vertices (there are n! of them!):
  - Find the weight of the circuit formed when the vertices are traversed in that order.
  - Then find the one with minimal weight.
- Take exponential time.

# **Knap Sack Problem**

- A set of n items, each having weight and value W[0:n-1], V[0:n-1], and a knapsack size K.
- Find a subset  $S\subseteq\{0,1,\ldots,n-1\}$ , such that  $\Sigma_{i\in S}W(i)\leq K$  and  $\Sigma_{i\in S}V(i)$  is maximised.
- Exhaustive approach: Consider all possible subsets of  $\{0, 1, ..., n-1\}$  (there are  $2^n$  of them!).
- For each subset as above, check if  $\Sigma_{i \in S} W(i) \leq K$ , and if so this is a feasible set.
- Among all feasible sets, choose the one which maximises  $\Sigma_{i \in S} V(i)$ .

# Some other examples

- Assigning n jobs to n people. Each person takes some time to do a job. Need to find assignment so that the total amount of time is minimised (where each person gets exactly one job to do).
- Cryptography.
   Encoding using a key.
   Decoding using the same (or corresponding) key.
- Brute force/exhaustive approach: Try to decode using all possible keys.
- Which one is the right answer: ? Usually only one key (or only a few of them) will give meanigful answer.
- Takes exponential time in the length of the keys.

## Summary

- Exhaustive search Algorithms take a lot of time, but simple to code
- In many cases there are much better ways to solve the problem
- Brute Force is "exhaustive search", but perhaps with some "easy" filtering.