



$i$  swap  $A[i]$  with  $A[\min]$

Trace:

0	1	2	3	4	5
<del>9</del>	<del>8</del>	8	<del>1</del>	9	<del>4</del>
1	4		<del>8</del>		<del>9</del>
			8		9



Analysis.

basic-operator. <

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

$$\sum_{i=0}^{n-2} (n-1-i) = \underset{i=0}{(n-1)} + \underset{i=1}{(n-2)} + \underset{i=2}{(n-3)} + \dots + \underset{i=n-2}{3+2+1}$$

$$= \frac{(n-1)n}{2} = \frac{n^2 - n}{2} \approx \frac{1}{2}n^2 \in \Theta(n^2) \text{ quadratic.}$$

what about swapping?  $S(n) = n-1 \in \Theta(n)$

• Solution: [Bubble Sort]

repeat

scan array and if two consecutive elements are out of place, swap them.

FUNCTION BubbleSort(  $A[0..n-1]$  )

FOR  $i \leftarrow 0$  TO  $n-1$  DO

FOR  $j \leftarrow 0$  TO  $n-2-i$  DO

IF  $A[j+1] < A[j]$

SWAP  $A[j+1]$  WITH  $A[j]$

Trace:

$i[123]$

0	1	2	3	4	5
<del>9</del>	<del>8</del>	8	1	<del>9</del>	<del>4</del>
8	9		9	4	9
1	8	9	4	9	<u>9</u>
	1	1	<u>8</u>		
	8	8			
		4	5		
	<u>4</u>	<u>5</u>			

Analysis: basic-operation. <

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

$$= \sum_{i=0}^{n-1} (n-1-i) = \frac{(n-1)n}{2} \in \Theta(n^2) \text{ quadratic.}$$

What about swaps? = IS  $\Theta(n^2)$  quadratic.

## • PROBLEM : Search

### • Sequential Search.

Given an array find if element  $x$  is in the array.

```
FUNCTION SeqSearch(A[0..n-1], x)
  FOR i ← 0 TO n-1 DO
    IF A[i] = x THEN
      RETURN true
  RETURN false.
```

Analysis.

Basic operation =

$$C(n) = \sum_{i=0}^{n-1} 1 = n \in \Theta(n) \text{ Linear.}$$

```
Python.                               for i in len(l):
l.index(e)                               p = l[i:]
```

### • String Matching.

Given a large string "text" and a shorter string "pattern",  
find the first occurrence of pattern in text.

$t_0, t_1, t_2, t_3, \dots, t_i, t_{i+1}, t_{i+2}, \dots, t_{i+m-1}, \dots, t_{n-1}$   
 $p_0, p_1, p_2, \dots, p_{m-1}$

idea:

compare  $p$  starting at  $t_0$   
compare  $p$  starting at  $t_1$   
" " " " "  $t_2$

until success

compare  $p$  starting at  $t_{n-m}$

```
FUNCTION stringSearch(T[0..n-1], P[0..m-1])
  FOR i ← 0 TO n-m DO
    j ← 0
    WHILE j < m and P[j] = T[i+j] DO
      j ← j+1
    IF j = m RETURN i
  RETURN -1
```

Trace.  $i=0$   
T = ME\_THINKS\_IS\_A\_WEASEL P = INK  
INK  
INK  
INK

INK  
INK  
INK  
j →

Analysis

Parameters  $m$   $n$   
basic operation =

$$C(n, m) = \sum_{i=0}^{n-m} \sum_{j=0}^{m-1} 1 = \sum_{i=0}^{n-m} m = (n-m+1)m = m \cdot n - m^2 + m = O(n \cdot m)$$

• PROBLEM : Closest-Pair

Given a collection of points  $P = \langle x, y \rangle$  in 2D space  
find the closest 2 points



$$d(p_i, p_j) = \sqrt{(x_i - x_j)^2 + (y_i - y_j)^2}$$

$$P = [ \langle x_0, y_0 \rangle, \langle x_1, y_1 \rangle, \langle x_2, y_2 \rangle, \dots, \langle x_{n-1}, y_{n-1} \rangle ]$$

FUNCTION bf-closest-pair(P)

```

d ← ∞
FOR i ← 0 TO n-2 DO
  FOR j ← i+1 TO n-1 DO
    d ← min(d, sqrt((P_i.x - P_j.x)^2 + (P_i.y - P_j.y)^2))
  RETURN d

```

trace [  $P_0$   $P_1$   $P_2$   $P_3$   $P_4$  ...  $P_{n-1}$  ]

tip

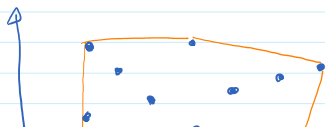
$$\sum_{i=L}^U 1 = U - L + 1$$

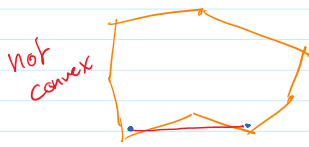
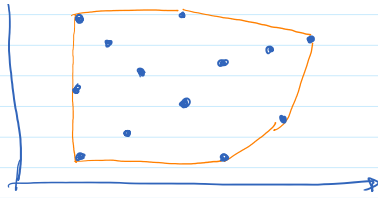
Analyse:

$$\begin{aligned}
A(n) &= \sum_{i=0}^{n-2} \sum_{j=i+1}^{n-1} 1 = \sum_{i=0}^{n-2} (n-1-i) \\
&= \sum_{i=0}^{n-2} (n-1-i) = (n-1) + (n-2) + (n-3) + \dots + 3 + 2 + 1 \\
&= \frac{n(n-1)}{2} = \Theta(n^2)
\end{aligned}$$

• PROBLEM : Convex Hull

find the smallest convex polygon that contains  
a set of points S

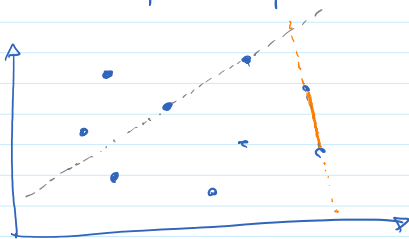




Convex:  
 for every 2 points inside  
 the polygon,  
 the line between these 2 points  
 is also inside the polygon

### NOTE

- the convex hull has vertices in the input set.  
 "extreme points"



Algorithm draft:

```

for every pair of points  $p_1, p_2$ 
  draw line  $l$  from  $p_1$  to  $p_2$ 
  for every point  $p_3$ 
    if all  $p_3$ 's are on the same side of  $l$ 
       $l$  belongs to the solution.
  
```

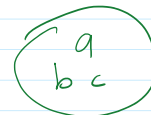
$$\approx O(n^3)$$

## • EXHAUSTIVE SEARCH

B.F. approach to problems of the following type.

Given a collection of input elements.  
 find a permutation/combinator/subset  
 that

- Satisfies certain constraint
- and/or
- Maximizes or Minimizes a characteristic.



abc  
 acb  
 bac  
 bca  
 cab  
 cba

### o PROBLEM (TSP) Traveling Salesman Problem

- Given a collection of cities  
 find a tour that all cities, and  
 returns to the starting point, minimizing  
 the cost.

fully connected, weighted.

- The problem can be represented as a Graph where you need to find a Hamiltonian Circuit that minimizes cost.

$$\langle v_0, v_1, v_2, v_3, \dots, v_{k-1}, v_0 \rangle$$

you are looking for the permutation of  $v_1 \dots v_{k-1}$  that minimizes cost.

BF Algorithm

cost  $\leftarrow \infty$   
for each permutation  $p$  of  $v_1 \dots v_{k-1}$   
if cost of  $p <$  cost  
keep  $p$ .  
cost  $\leftarrow$  cost of  $p$ .

$$\approx \Theta(n!)$$

### o PROBLEM Knapsack Problem

Given a collection of items,  $e_1, e_2, \dots, e_n$   
each with a weight  $w_1, w_2, \dots, w_n$   
and a value  $v_1, v_2, \dots, v_n$ .

and a knapsack of capacity  $W$

Which items to load on the knapsack to maximize value?

What you need is to select the subset  $\{e_1, \dots, e_n\}$  that - total weight is less than  $W$   
- maximize value.

BF:

value  $\leftarrow 0$   
for every subset  $S$  of  $\{e_1, \dots, e_n\}$   
if weight of  $S \leq W$   
if value of  $S >$  value  
save  $S$   
value  $\leftarrow$  value of  $S$

$$\approx \Theta(2^n)$$

	a	b	c	d
{}	0	0	0	0
{a}	1	0	0	0
{b}	0	1	0	0
{c}	0	0	1	0
{d}	0	0	0	1
{a,b}	1	1	0	0
{a,c}	1	0	1	0
...				
{a,b,c,d}	1	1	1	1

• Is there a way to lower complexity?

Nobody knows.

NP-Hard. - No polynomial algorithm is known.

- Common belief: "they don't exist"

### o PROBLEM Assignment Problem

- Given a list of  $n$  people, and a list of  $n$  jobs.
  - and the cost of person  $i$  doing Job  $j$
- find the assignment of jobs to people that minimize cost.

e.g.

	Job1	Job2	Job3	Job4
Kevin	9	2	7	8
Ehobi	6	4	8	7
John	5	8	1	8
Jake	7	6	9	4

$\langle 1, 2, 3, 4 \rangle$

- you need to select one item per row.
- making sure that no two selected items are in the same column
- minimizing total cost.

BF:

```
cost ← ∞
for every permutation  $p$  of  $\langle 1 \dots n \rangle$ 
  if cost of  $p < cost$ 
    save  $p$ 
    cost ← cost of  $p$ 
```

$\approx O(n!)$

NOTE: Better algorithm do exists.

Just because the Brute Force approach is exponential ( $2^n$  or  $n!$ ) does not mean that all hope is lost and better algorithms don't exist.

### • Exhaustive Search on a Graph:

$G = \langle V, E \rangle$      $V$ : vertices  
                           $E$ : edges.

• Consider Undirected graphs.

• Exhaustively searching a graph "testing" all nodes.

### o Depth-First Search

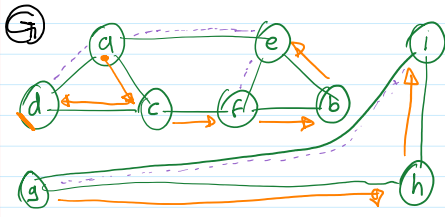
Algorithm:

```
FUNCTION DFS( $G$ )
  mark each vertex  $v$  as "unvisited"
  count ← 0
  FOR EACH vertex  $v$  in  $V$  DO
    IF  $v$  is marked as unvisited
      dfs( $v$ )
```

```
FUNCTION dfs( $v$ )
  count ← count + 1
  mark  $v$  with count
```

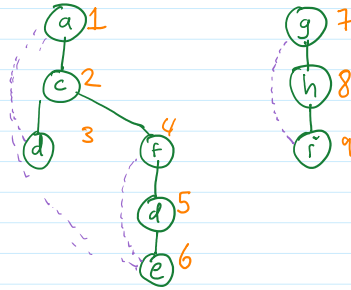
FOR EACH vertex  $u$  adjacent to  $v$  DO  
 IF  $u$  is marked as unvisited  
 dfs( $u$ )

Trace:



DFS trace  
 count 1 2 3 4  
 5 6 7 8 9

tree-edges  
 back-edges.



Applications:

- ▣ Connectivity
- ▣ Cycle Checking.
- ▣ path existence.
- ▣ Serializing the graph.

o Breadth-First Search

Algorithm.

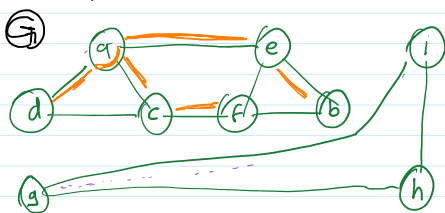
```

FUNCTION BFS(G)
  mark every vertex as unvisited
  FOR EACH vertex v
    IF v is unvisited
      bfs(v)
  
```

```

FUNCTION bfs(v)
  count ← count + 1
  mark v with count
  enqueue v
  WHILE queue is not empty DO
    u ← front of queue
    dequeue
    FOR Each vertex w adjacent to u DO
      IF w is unmarked THEN
        count ← count + 1
        mark w
        enqueue w.
  
```

Trace:



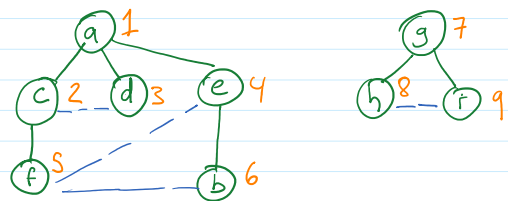
BFS

Q [g h i]

count [3]

u [i]

tree-edges.  
 cross-edges.





- 1. - the starting point.
- 2,3,4. - vertices one edge removed.
- 5,6. - vertices two edges removed.

Applications:

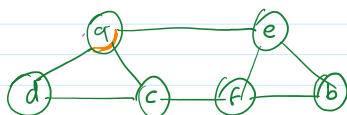
- ⊕ BFS finds paths with the least edges
- Same kind of applications as DFS.

• Complexity:

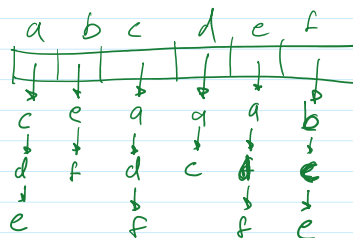
The Data Structure you use matters.

Adjacency Matrix

	a	b	c	d	e	f
a	1	0	1	1	1	0
b	0	1	0	0	1	1
c	1	0	1	1	0	1
d	1	0	1	1	0	0
e	1	1	0	0	1	1
f	0	1	1	0	1	1



Adjacency List



$$\Theta(|V|^2)$$

$$\Theta(|V| + |E|)$$

— EOF —