# Course – Analysis and Design of Algorithms

UNIT 2 - Part 2



#### Unit 2:Decrease-and-Conquer

- Insertion Sort
- Topological Sorting
- Algorithms for Generating Combinatorial Objects
- Decrease-by-a-Constant-Factor Algorithms: Binary Search
- Variable-Size-Decrease Algorithms: Computing Median and the Selection Problem

#### Unit 2:Decrease-and-Conquer

- Introduction

#### Decrease-and-Conquer

The **decrease-and-conquer** technique is based on exploiting the relationship between a solution to a given instance of a problem and a solution to its smaller instance.

- Once such a relationship is established, it can be exploited either top down or bottom up.
- Top down approach leads naturally to a recursive implementation.
- The bottom-up variation is usually implemented iteratively, starting with a solution to the smallest instance of the problem; it is called sometimes the incremental approach.

#### Decrease-and-Conquer

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There are three major variations of decrease-and-conquer:

- Decrease by a constant
- Decrease by a constant factor
- Variable size decrease

### Decrease-and-Conquer

There are three major variations of decrease-and-conquer:

#### **Decrease by a constant (or Decrease by One)**

The Size of an instance is reduced by same constant (usually by one) at each iteration of the algorithm.

#### **Decrease by a constant factor** (or Decrease by **half**)

The size of a problem instance is reduced by same constant factor (usually by half) on each iteration of the algorithm.

#### Variable size decrease

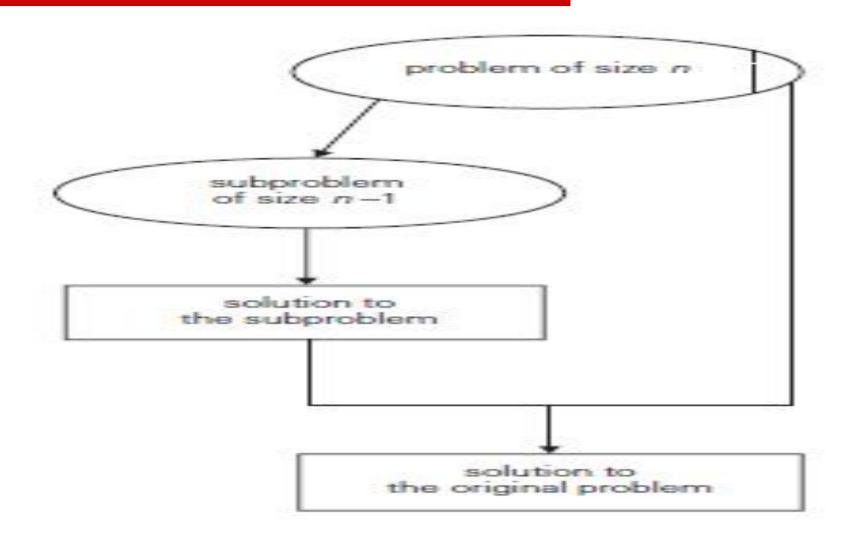
A size reduction pattern varies from one iteration to another

#### Three major variations of decrease-and-conquer

- Decrease-by-a-constant variation, the size of an instance is reduced by the same constant on each iteration of the algorithm. Typically, this constant is equal to one.
- Example: we can **compute**  $a^n$  **recursively** (top-down approach) using  $a^n = a^{n-1} * a$ . The recurrence relation to compute  $a^n$  using decrease-and-conquer method is

$$f(n) = \begin{cases} f(n-1) \cdot a & \text{if } n > 0, \\ 1 & \text{if } n = 0, \end{cases}$$

#### Decrease-(by one)-and-conquer technique.



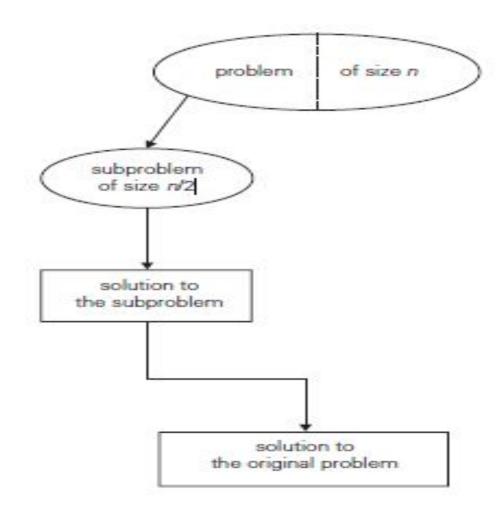
#### Three major variations of decrease-and-conquer

- Decrease-by-a-constant-factor technique suggests reducing a problem instance by the same constant factor on each iteration of the algorithm. In most applications, this constant factor is equal to two.
- Example: To compute  $a^n$ , the instance of half its size is to compute  $a^{n/2}$ , with the obvious relationship between the two:  $a^n = (a^{n/2})^2$ . But

$$a^{n} = \begin{cases} (a^{n/2})^{2} & \text{if } n \text{ is even and positive,} \\ (a^{(n-1)/2})^{2} \cdot a & \text{if } n \text{ is odd,} \\ 1 & \text{if } n = 0. \end{cases}$$

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### Decrease-(by half)-and-conquer technique.



#### Three major variations of decrease-and-conquer

Variable-size-decrease variety of decrease-and-conquer, the size-reduction pattern varies from one iteration of an algorithm to another. Euclid's algorithm for computing the greatest common divisor provides a good example of such a situation.

$$gcd(m,n) = \begin{cases} m & \text{if } n=0 \\ gcd(n, m \mod n) & \text{Otherwise} \end{cases}$$

Computing gcd(6,10)

M	N	Description
6	10	Since n is not 0, m $\leftarrow$ n and n $\leftarrow$ m % n. So, 1.e., M $\leftarrow$ 10 and N $\leftarrow$ 6 % 10
10	6	Since n is not 0, m $\leftarrow$ n and n $\leftarrow$ m % n. So, $M \leftarrow 6$ and N $\leftarrow$ 10 % 6 = 4
6	4	Since n is not 0, m $\leftarrow$ n and n $\leftarrow$ m % n. So, M $\leftarrow$ 4 and N $\leftarrow$ 6 % 4 = 2
4	2	Since n is not 0, m $\leftarrow$ n and n $\leftarrow$ m % n. So, M $\leftarrow$ 2 and N $\leftarrow$ 4 % 2 = 0
2	0	Since $N = 0$ the GCD will be the value of M which is 2.

### Question

Ferrying soldiers A detachment of n soldiers must cross a wide and deep river with no bridge in sight. They notice two 12-year-old boys playing in a rowboat by the shore. The boat is so tiny, however, that it can only hold two boys or one soldier. How can the soldiers get across the river and leave the boys in joint possession of the boat? How many times need the boat pass from shore to shore?

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#### **Solution**

First, the two boys take the boat to the other side, after which one of them returns with the boat. Then a soldier takes the boat to the other side and stays there while the other boy returns the boat. These four trips reduce the problem's instance of size n (measured by the number of soldiers to be ferried) to the instance of size n-1. Thus, if this four-trip procedure repeated n times, the problem will be solved after the total of 4n trips.

## Applying Decrease by One Strategy

#### Ferrying Soldiers

Apply <u>decrease-by-1</u> process:

- Ferry one soldier to the far side, leaving boat and boys back at their initial positions
- If no soldiers remain, we have finished,
- Otherwise, ferry remaining n-1 soldiers

How many (one way) boat trips will it take to ferry one soldier?

A. 1 B. 2 C. 3 **D. 4** E. 5 F. 6

#### Homework Problem

Alternating glasses There are 2n glasses standing next to each other in a row, the first n of them filled with a soda drink while the remaining n glasses are empty. Make the glasses alternate in a filled-empty-filled-empty pattern in the minimum number of glass moves.



Assuming that the glasses are numbered left to right from 1 to 2n, pour soda from glass 2 into glass 2n-1. This makes the first and last pair of glasses alternate in the required pattern and hence reduces the problem to the same problem with 2(n-2) middle glasses. If n is even, the number of times this operation needs to be repeated is equal to n/2; if n is odd, it is equal to (n-1)/2. The formula  $\lfloor n/2 \rfloor$  provides a closed-form answer for both cases. Note that this can also be obtained by solving the recurrence M(n) = M(n-2) + 1 for n > 2, M(2) = 1, M(1) = 0, where M(n) is the number of moves made by the decrease-by-two algorithm described above. Since any algorithm for this problem must move at least one filled glass for each of the  $\lfloor n/2 \rfloor$  nonoverlapping pairs of the filled glasses,  $\lfloor n/2 \rfloor$  is the least number of moves needed to solve the problem.

#### Unit 2: Insertion Sort

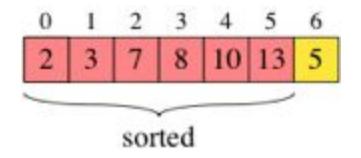
- Introduction

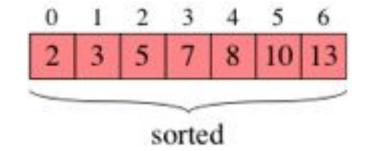
#### **Insertion Sort: Introduction**

- □ This Sorting technique is very efficient if the elements to be sorted are partially arranged in ascending order.
- This technique is similar to the way a librarian keeps the books in the shelf.
- Initially all books will be placed in the shelf in increasing order of the access key number.
- When student returns the book to the librarian, he compares the access key of this book with other books in shelf one by one and inserts into the correct position so that all books are arranged in increasing order of their access key.

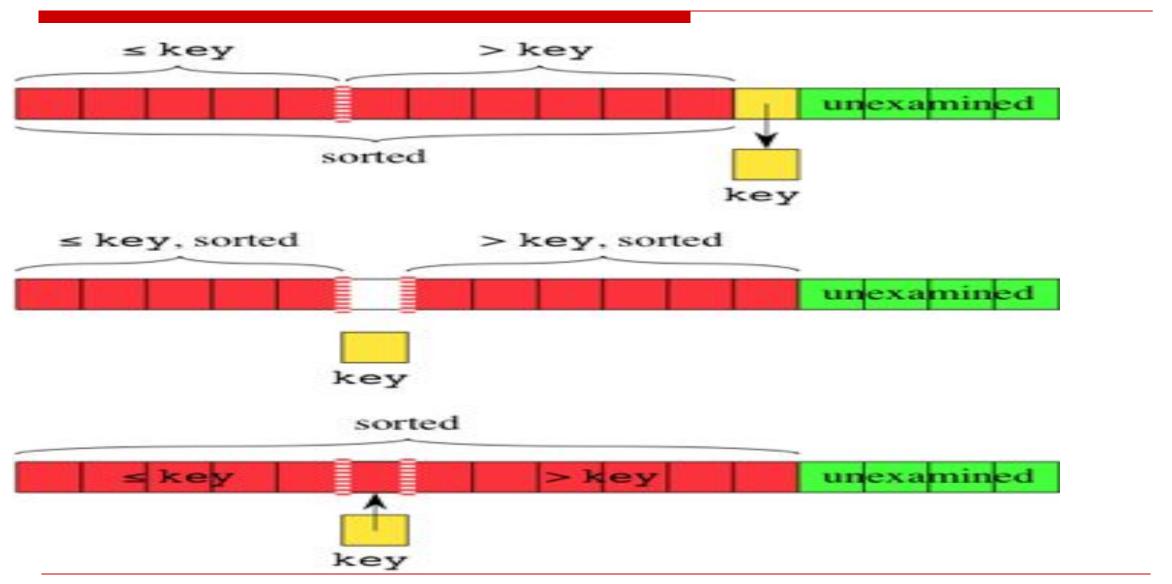
## Insertion Sort: Logic

- Consider array of n elements to sort.
- We assume a[i] is the item to be inserted.
  - Compare the item a[i] from position (i-1) down to 0. The item to be compared with a[j], (i-1)>= j>=0 where initially j is (i-1).
  - As long as the item is less than a[j], copy a[j] to a[j+1] and decrement j by 1.
  - As we decrement j by one, we should see that j should be greater than or equal to zero.
  - When the item is greater than a[j] or j less than zero, insert item into a[j+1]
- If the above procedure is repeated for item a[i] for 0 < i < n, then all items in the array a will be sorted.





### Insertion Sort: Logic

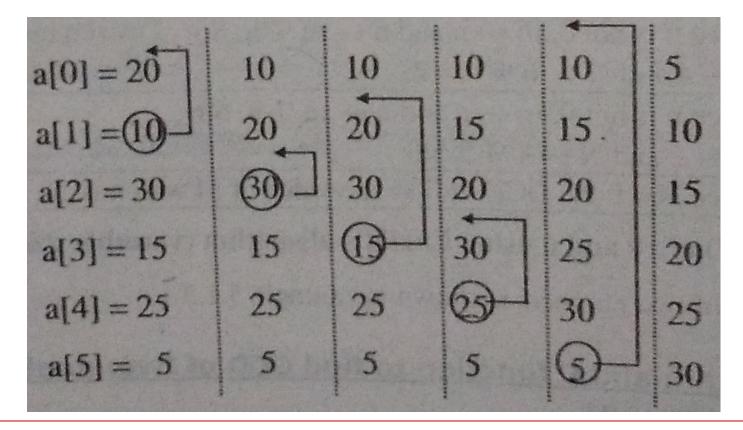


### Insertion Sort: Example

□ Sort the elements (20,10,30,15,25,5) using Insertion Sort

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### Question

Sort the elements (89, 45, 68, 90, 29, 34, 17)
 using Insertion Sort

## Question

Sort the elements (89, 45, 68, 90, 29, 34, 17) using Insertion Sort

```
68
     89 |
         68
               90
                         34
45
     68
          89 |
               90
                         34
     68
         89
               90 I
                    29
45
     45
         68
               89
    34
         45
               68
         34
               45
                         89
    29
```

#### Homework Problem

□ Apply insertion sort to sort the list E, X, A, M, P, L, E in alphabetical order.

## Insertion Sort: Algorithm

```
ALGORITHM InsertionSort(A[0..n - 1])
//Sorts a given array by insertion sort
//Input: An array A[0..n - 1] of n orderable elements
//Output: Array A[0..n - 1] sorted in nondecreasing order
for i ←1 to (n - 1) {
item \leftarrow A[i]
j \leftarrow (i-1)
while j \ge 0 and A[j] > item {
    A[j+1]\leftarrow A[j]
   j \leftarrow j - 1
A[j + 1] \leftarrow item
```

## **Insertion Sort: Analysis**

- □ The basic operation of the algorithm is the key comparison A[j] > item.
- The number of key comparisons in this algorithm obviously depends on the nature of the input.

## Insertion Sort: Best case Analysis

Best case occurs when the elements to be inserted is already sorted.

$$C(n) = \sum_{i=1}^{n-1} 1 = (n-1)-1+1 = n-1 = \Omega(n)$$

## Insertion Sort: Worst case Analysis

Worst case occurs when the condition A[j] > item is executed maximum number of times. This situation occurs when the elements of the arrays are sorted in descending order.

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

$$= (n-1) + (n-2) + \dots + 3 + 2 + 1$$

$$= \frac{(n-1)n}{2}$$
So, if we consider  $f(n) = \frac{(n-1)n}{2} = n^2/2 - n/2$ , then
$$n^2/2 - n/2 \le n^2 \qquad \text{for } n \ge 0 \text{ which is of the form}$$

$$f(n) \le c_2 g(n) \text{ for } n \ge n_0 \text{ where } c = 1, n_0 = 0 \text{ g(n)} = n^2. \text{ So, by definition,}$$

$$f(n) = O(g(n)) = O(n^2).$$
So, time complexity of insertion sort in the worst case is  $O(n^2)$ 

# Insertion Sort: Average Case Analysis

Let us assume that two elements are already sorted and we have to insert the 3<sup>rd</sup> item at the appropriate position. There are 3 possible places where the item can be inserted. Let us take all possible cases one by one.

Case 1: i = 2 (position where the item has to be inserted) and Item = a[2] = 13

A	10	12	13
		1	
		1	1
		j	i

It is clear from figure that the item is already in the correct position and has to be inserted in the same position. Since item 13 is greater than a[j], control comes out of the while loop and the while loop is executed only once. So, the total number of times the while loop is executed is 1.

Case 2: i = 2 (position where the item has to be inserted) and Item = a[2] = 11

1	10	12	111
	0	1	2
		1	1
		j	i

Note that the item 11 has to be compared with 12 and 10 and should be inserted between 10 and loop is executed is 2.

# Insertion Sort: Average Case Analysis

Case 3: i = 2 (position where the item has to be inserted) and Item = a[2] = 9

In this case, item 9 is compared with 12 and 10 and should inserted before 10 which results in while loop to be executed 3 times.

Note that all these three cases have the same probability and the average number of times the while loop is executed is given by

$$\left(\frac{1+2+3}{3}\right)=2$$

This result is true if we are inserting the 3<sup>rd</sup> element in to the array. In general, to insert an item X with index i, in the correct position, the total number of times the while loop is executed is given

$$\frac{\sum_{j=1}^{i} j}{i} = \frac{i(i+1)}{2*i} = \frac{i+1}{2} \qquad \frac{(1+2+3....+i)}{i}$$

It is clear from the algorithm that the index variable *i* starts from 1 to n-1. So, the total number of

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

$$\sum_{i=1}^{n-1} \frac{i+1}{2} = \frac{1}{2} \sum_{i=1}^{n-1} i+1 = \frac{1}{2} (2+3+....n)$$

$$= \frac{1}{2} \left( \left[ \frac{n(n+1)}{2} \right] - 1 \right) = \frac{1}{2} \left( \frac{n^2}{2} + \frac{n}{2} - 1 \right)$$

$$= \frac{n^2}{4} + \frac{n}{4} - \frac{1}{2} = \frac{n^2}{4} = n^2$$

So, time complexity of insertion sort in the average case is  $\theta(n^2)$ 

#### **Topological Sorting**

Idea: For a directed Acyclic Graph, Topological sorting is a Linear ordering of vertices such that for every directed edge (u,v) vertex u comes before v in ordering.



#### Topological Sorting using the following two methods

- Source Removal Method
- Depth First search method

#### **Topological Sorting**

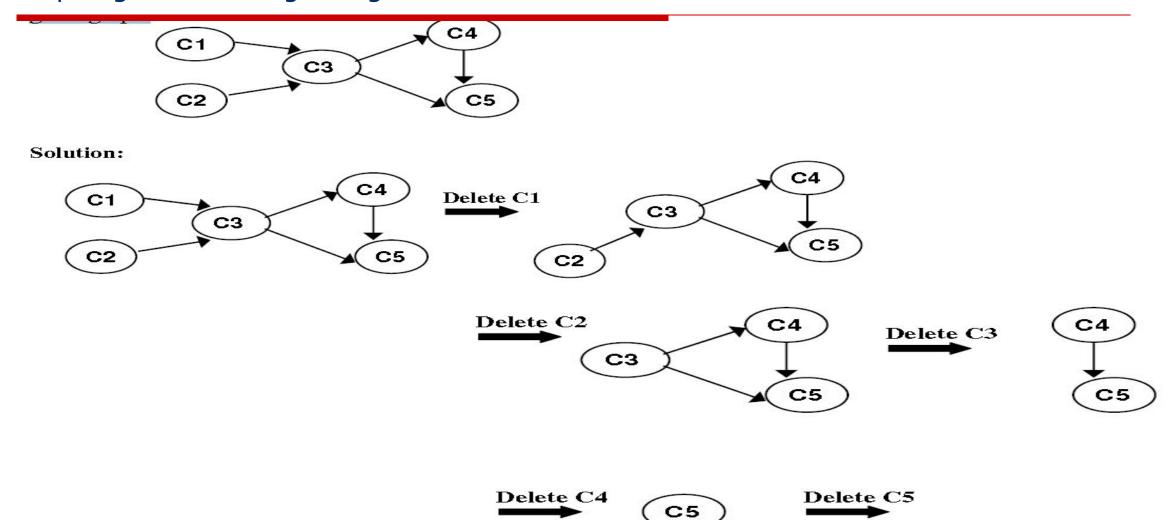
#### **Source Removal Method:**

Is based on direct implementation of decrease and conquer technique.

Repeatedly, identify in a remaining digraph a source, which is a vertex with no incoming edge and delete it along with all edges outgoing from it.

The order in which the vertices are deleted yields a solution to topological sorting problem.

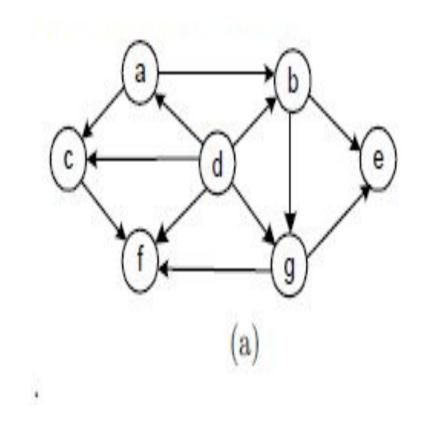
#### Topological Ordering Using Source Removal method

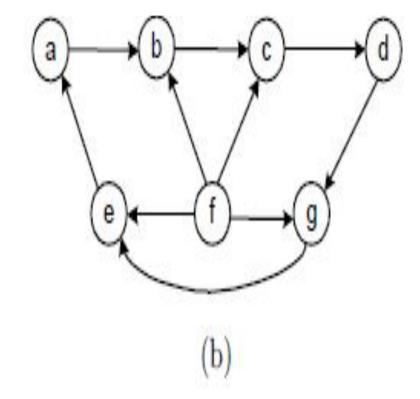


The topological order is C1, C2, C3, C4, C5

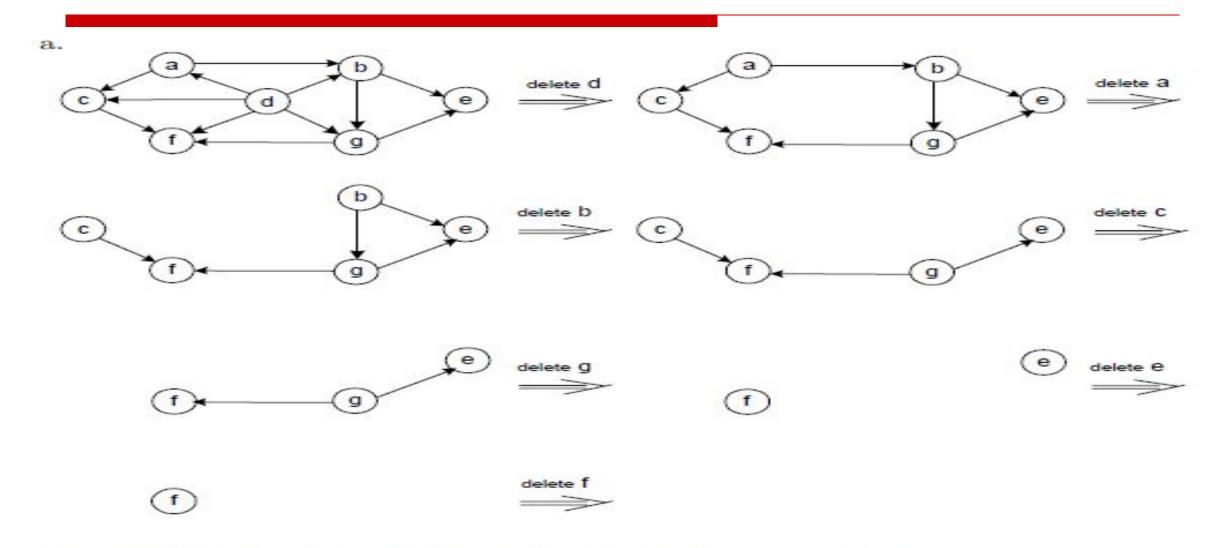
# Question

☐ Apply the source-removal algorithm to the digraphs



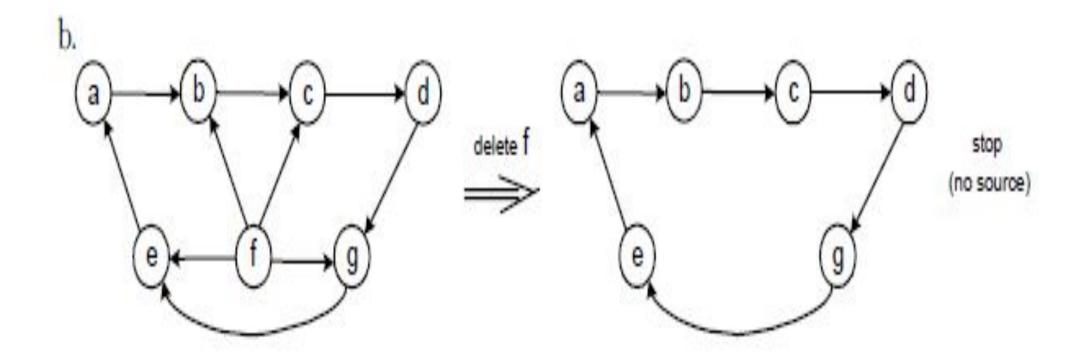


#### **Answer**



The topological ordering obtained is d a b c g e f.

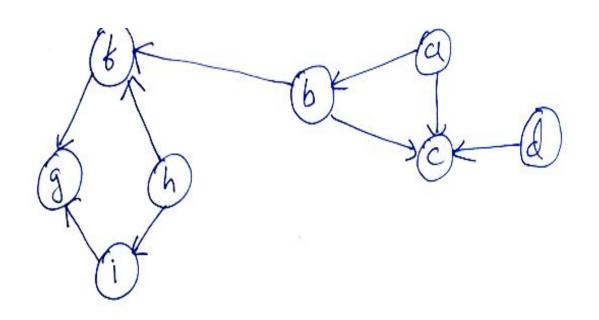
### Answer: should be a DAG

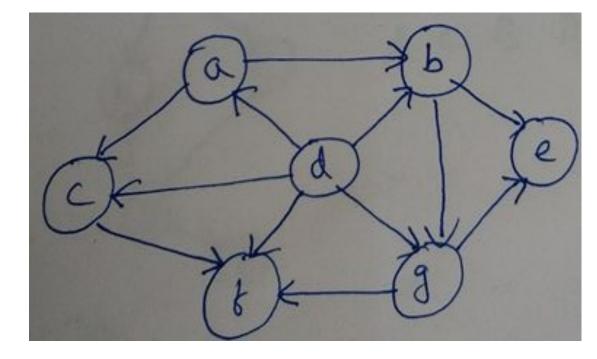


The topological sorting is impossible.

### Homework Problem

 Find topological Sorting order for the following graphs using Source removal methods





```
AIM: Write program to obtain the Topological ordering of vertices in a given digraph. Note: In
the record book students should Source removal method
Algorithm topological_sort(a,n,T)
//purpose :To obtain the sequence of jobs to be executed resulting topological order
// Input:a-adjacency matrix of the given graph n-the number of vertices in the graph
//output: T-indicates the jobs that are to be executed in the order
Step 1:[Obtain indgree of each vertex]
For j < -0 to n-1 do
   sum < -0
   for i < -0 to n-1 do
        sum<-sum+a[i]
   end for
    indegree[i] <- sum</pre>
end for
```

AIM: Write program to obtain the Topological ordering of vertices in a given digraph. Note: In the record book students should Source removal method

```
Step 2: [Place the independent jobs which have not been processed on the stack]
```

```
☐ For <- 0 to n-1 do
</p>
```

☐ If(indegree[i]=0) //Place the job on the stack

```
\Box top <- top+1
```

- end if
- end for

```
Step 3: [Find the topological sequence]
   While (top!=1)
       u <- s[top]
       top <- top -1
   Add u to solution vector T
   For each vertex v adjacent to u
       Decrement indegree[v] by one
       If(indegree[v]=0)
           Top <- top +1
           s[top] <- v
       end if
   end for
   end while
Step 4: write T
Step 5: return
```

### **Topological Sorting**

#### **Depth Firs search method:**

Perform DFS traversal and note down the order in which nodes become dead ends (popped off the stack).

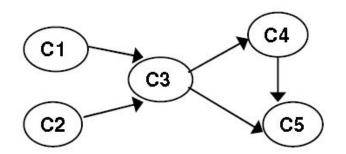
Reversing this order yields a solution to the topological sorting problem.

Provided of course, no back edge has been encountered during traversal. If a back edge has been encountered then the digraph is not DAG (Directed Acyclic Graph) and topological sorting is impossible.

# Example

Apply DFS – based algorithm to solve the topological sorting problem for the given

graph:



Step	Graph	Remarks
1	C1	Insert C1 into stack C1(1)
2	C1 C3	Insert C2 into stack  C3 (2) C1(1)
3	C1 C3 C4	Insert C4 into stack C4 (3) C3 (2) C1(1)
4	C1 C3 C5	Insert C5 into stack  C5 (4) C4 (3) C3 (2) C1(1)

# Example (Contd...)

	5	NO unvisited adjacent vertex for C5, backtrack	Delete C5 from stack
C1 C3 C4			C5 (4, 1) C4 (3) C2 (2) C1(1)
(C2) (C5)	6	NO unvisited adjacent vertex for C4, backtrack	Delete C4 from stack  C5 (4, 1)  C4 (3, 2)  C3 (2)  C1(1)
	7	NO unvisited adjacent vertex for C3, backtrack	Delete C3 from stack  C5 (4, 1)  C4 (3,2)  C3 (2, 3)  C1(1)
	8	NO unvisited adjacent vertex for C1, backtrack	Delete C1 from stack  C5 (4, 1) C4 (3,2) C3 (2, 3) C1(1, 4)

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## Example (Contd...)

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Stack becomes empty, but there is a node which is unvisited, therefore start the DFS again from arbitrarily selecting a unvisited node as source

		-
(a)	C4	)
C1 C3	$\overline{}$	
(C2)	C	5

C2	msert e2 me stack
<u> </u>	C5 (4, 1)
	C5 (4, 1) C4 (3,2)
	C2 (2, 3)
	$C_1(1,4) C_2(5)$

Insert C2 into stack

NO unvisited adjacent vertex for C2, backtrack

C5 (4, 1)
C4 (3,2)
C2 (2, 3)
C1(1, 4)
C2(5, 5)

Stack becomes empty, NO unvisited node left, therefore algorithm stops.

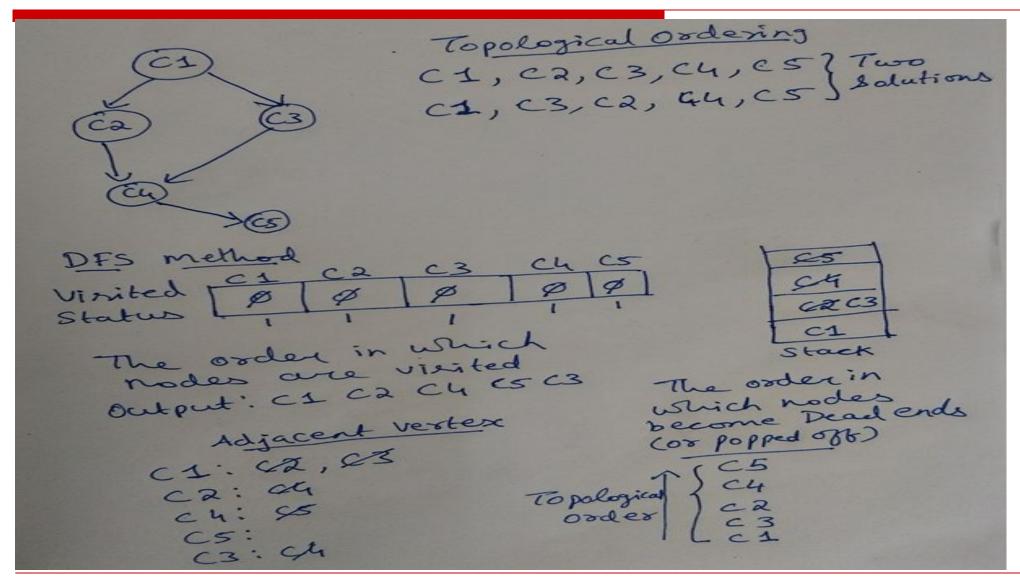
The popping – off order is:

C5, C4, C3, C1, C2,

Topologically sorted list (reverse of pop order):

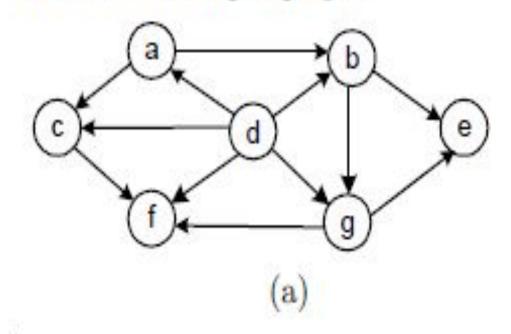
 $C2, C1 \rightarrow C3 \rightarrow C4 \rightarrow C5$ 

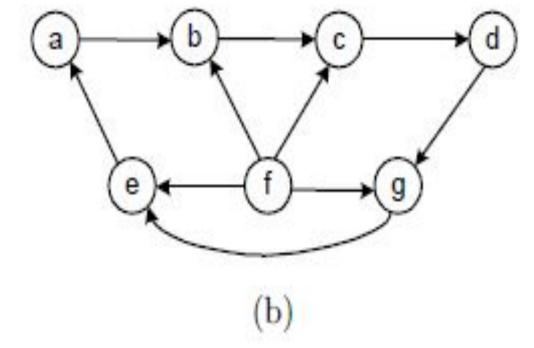
#### Topological Sorting: Using Depth First Search method



#### Homework Problem

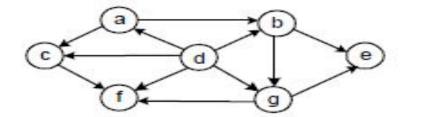
Apply the DFS-based algorithm to solve the topological sorting problem for the following digraphs:





### **Answer**

a. The digraph and the stack of its DFS traversal that starts at vertex a are given below:

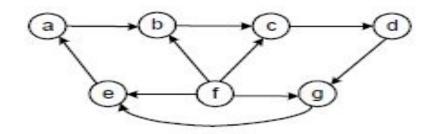


The vertices are popped off the stack in the following order:

The topological sorting order obtained by reversing the list above is

$$dacbgfe$$
.

b. The digraph below is not a dag. Its DFS traversal that starts at a encounters a back edge from e to a:



g d c

#### Homework Problem

For a digraph with n vertices, what is the largest number of distinct solutions the topological sorting problem can have?

#### **Answer:**

For a digraph with n vertices and n₀ edges, any permutation of its vertices solves the topological sorting problem. Hence, the answer to the question is n!.

#### Algorithms for Generating Combinatorial Objects

The most important types of combinatorial objects are *permutations, combinations, and subsets* of a given set.

They typically arise in problems that require a consideration of different choices.

- Travelling Salesman Problem all permutations of the cities.
- □ We assume that the underlying set whose elements need to be permuted is simply the set of integers from 1 to n; more generally, they can be interpreted as indices of elements in an n-element set {a1,...,an}.
- □ The decrease-by-one technique for the problem of generating all n! permutations of {1,...,n}, would be n(n − 1)!= n!
- We can insert n in the previously generated permutations either left to right or right to left. It turns out that it is beneficial to start with inserting n into  $1 \ 2 \dots (n-1)$  by moving right to left and then switch direction every time a new permutation of  $\{1,\dots,n-1\}$  needs to be processed.
- An example of applying this approach **bottom up** for n = 3 is given below: start 1

insert 2 into 1 right to left 12 21

insert 3 into 12 right to left 123 132 312

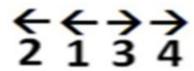
insert 3 into 21 left to right 321 231 213

- It is possible to get the same ordering of permutations of n elements without explicitly generating permutations for smaller values of n.
- It can be done by associating a direction with each element k in a permutation. We indicate such a direction by a small arrow written above the element in question, e.g.,

 $\overrightarrow{3}$   $\overrightarrow{2}$   $\overrightarrow{4}$   $\overrightarrow{1}$ .

The element k is said to be mobile in such an arrow-marked permutation if its arrow points to a smaller number adjacent to it. For example, for the permutation

- □ 3 and 4 are mobile while 2 and 1 are not.
- Identify the mobile element/integer--->



### **ALGORITHM** JohnsonTrotter(n)

Using the notion of a mobile element, we can give the following description of the Johnson-Trotter algorithm for generating permutations.

```
//Implements Johnson-Trotter algorithm for generating permutations
//Input: A positive integer n
//Output: A list of all permutations of \{1, \ldots, n\}
initialize the first permutation with 1 \ 2 \dots n
while the last permutation has a mobile element do
    find its largest mobile element k
    swap k with the adjacent element k's arrow points to
    reverse the direction of all the elements that are larger than k
    add the new permutation to the list
```

#### **Johnson and Trotter algorithm**

The Johnson and Trotter algorithm doesn't require to store all permutations of size n-1 and doesn't require going through all shorter permutations. Instead, it keeps track of the direction of each element of the permutation.

- Find out the largest mobile integer in a particular sequence. A directed integer is said to be mobile if it is greater than its immediate neighbor in the direction it is looking at.
- $\square$  Switch this mobile integer and the adjacent integer to which its direction points.
- Switch the direction of all the elements whose value is greater than the mobile integer value.
- $\square$  Repeat the step 1 until unless there is no mobile integer left in the sequence.
- https://www.geeksforgeeks.org/johnson-trotter-algorithm/

Here is an application of this algorithm for n = 3, with the largest mobile element shown in bold:

```
123 132 312 321 231 213.
```

insert 3 into 12 right to left 123 132 312 insert 3 into 21 left to right 321 231 213

This algorithm is one of the most efficient for generating permutations; it can be implemented to run in time proportional to the number of permutations, i.e. in Θ(n!), which is horribly slow for all but very small values of n.

Generate all the permutations for n = 4: 1 2 3 4

1234	1243	1423	4123
4132	1432	1342	1324
3124	3142	3412	4312
4321	3421	3241	3214
2314	2341	2431	4231
4213	2413	2143	2134

3124	2314
3142	2 3 4 1
3412	2431
4312	4231
4321	4213
3 4 2 1	2413
3241	$\begin{array}{c} \leftarrow \leftarrow \rightarrow \rightarrow \\ 2 \ 1 \ 4 \ 3 \end{array}$
$\overrightarrow{3}$ $\overrightarrow{2}$ $\overrightarrow{1}$ $\overrightarrow{4}$	$\begin{array}{c} \leftarrow \leftarrow \rightarrow \rightarrow \\ 2 \ 1 \ 3 \ 4 \end{array}$
	★       3       4       3       4       4       4       3       4       3       4       3       4       3       4       3       4       3       4       3       4       3       4       4       3       4    <

### Lexicographic Permutation

123 132 312 321 231 213.

□ 123 132 213 231 312 321

### Lexicographic Permutation

```
ALGORITHM LexicographicPermute(n)
//Generates permutations in lexicographic order
//Input: A positive integer n
//Output: A list of all permutations of {1,...,n} in lexicographic order
 initialize the first permutation with 12 ...n
 while last permutation has two consecutive elements in increasing order do
       let i be its largest index such that ai < ai+1 //ai+1 > ai+2 > ... > an
       find the largest index j such that ai < aj //j \ge i + 1 since ai < ai+1
       swap ai with aj //ai+1ai+2 ...an will remain in decreasing order
       reverse the order of the elements from ai+1 to an inclusive
       add the new permutation to the list
```

- ☐ Knapsack problem –all subsets of the items.
- The decrease-by-one idea is immediately applicable to this problem, too. All subsets of  $A = \{a1,...,an\}$  can be divided into two groups: those that do not contain  $a_n$  and those that do.
- □ The former group is nothing but all the subsets of {a1,...,an-1}, while each and every element of the latter can be obtained by adding an to a subset of {a1,...,an-1}.
- □ Thus, once we have a list of all subsets of {a1,...,an-1}, we can get all the subsets of {a1,...,an} by adding to the list all its elements with an put into each of them.
- An application of this algorithm to generate all subsets of {a1, a2, a3} is illustrated below:

n	subsets							
0	Ø							
1	Ø	$\{a_1\}$						
2	Ø	$\{a_1\}$	$\{a_2\}$	$\{a_1, a_2\}$				
3	Ø	$\{a_1\}$	$\{a_2\}$	$\{a_1, a_2\}$	$\{a_3\}$	$\{a_1, a_3\}$	$\{a_2, a_3\}$	$\{a_1, a_2, a_3\}$

- A convenient way of solving the problem directly is based on a one-to-one correspondence between all 2n subsets of an n element set  $A = \{a1,...,an\}$  and all 2n bit strings b1,...,bn of length n.
- The easiest way to establish such a correspondence is to assign to a subset the bit string in which bi = 1 if ai belongs to the subset and bi = 0 if ai does not belong to it.
- For example, the bit string 000 will correspond to the empty subset of a three-element set, 111 will correspond to the set itself, i.e., {a1, a2, a3}, and 110 will represent {a1, a2}.
- With this correspondence in place, we can generate all the bit strings of length n by generating successive binary numbers from 0 to 2n − 1, padded, when necessary, with an appropriate number of leading 0's.
- For example, for the case of n = 3, we obtain bit strings 000 001 010 011 100 101 110 111 subsets  $\emptyset$  {a3} {a2} {a2, a3} {a1} {a1, a3} {a1, a2} {a1, a2, a3}

- We require a minimal-change algorithm for generating bit strings so that every one of them differs from its immediate predecessor by only a single bit.
- In the language of subsets, we want every subset to differ from its immediate predecessor by either an addition or a deletion, but not both, of a single element.
- □ The solution is the binary reflected Gray code.
- For example, for n = 3, we can get  $000 \ 001 \ 011 \ 010 \ 110 \ 111 \ 101 \ 100$

#### **ALGORITHM** BRGC(n)

```
//Generates recursively the binary reflected Gray code of order n
//Input: A positive integer n
//Output: A list of all bit strings of length n composing the Gray code
if n = 1 make list L containing bit strings 0 and 1 in this order
else generate list L1 of bit strings of size n-1 by calling BRGC(n-1)
    copy list L1 to list L2 in reversed order
    add 0 in front of each bit string in list L1
    add 1 in front of each bit string in list L2
    append L2 to L1 to get list L
return L
```

## Decrease by a Constant Factor

Binary Search

### Thanks for Listening