

S. J. P. N. TRUST'S HIRASUGAR INSTITUTE OF TECHNOLOGY, NIDASOSHI Accredited at 'A' Grade by NAAC Programmes Accredited by NBA: CSE, ECE, EEE & ME.

Department of Computer Science & Engineering

Course: Design And Analysis of Algorithms (18CS42)

Module 3: Greedy Method, Minimum Cost Spanning Tree, Single Source Shortest Path, Optimal Tree Problem, Transform And Conquer Approach

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Module – 3 Greedy Method

- 1. Introduction
- 2. Coin Change Problem
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- 5. Spanning Tree
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Module – 3 Greedy Method

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- 8. Kruskal's Algorithm
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- **10. Dijkstra's Algorithm**
- **11. Huffman Trees & Codes**
- **12. Heaps and Heap Sort**

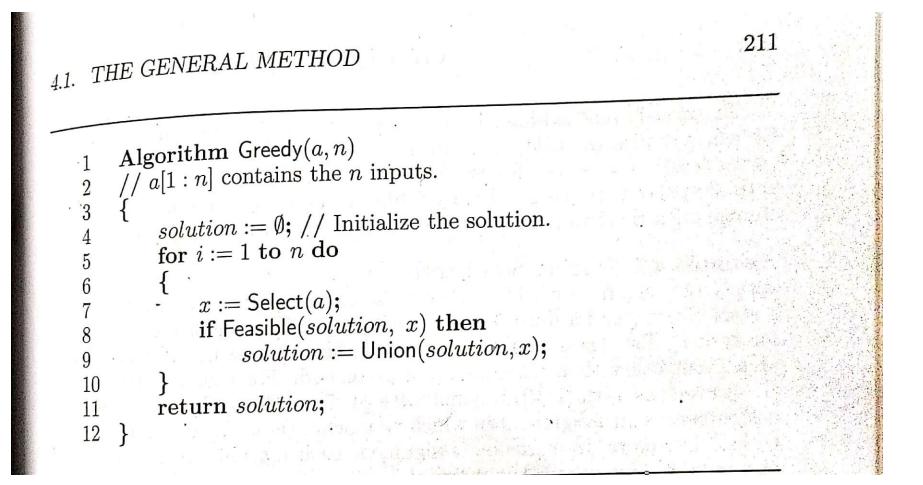
Introduction

- Greedy method is an optimization technique used to solve many real time examples
- Greedy method has a constraint that must be followed
- Greedy method has a objective to achieve
- Objective of greedy method is to find either minimum or maximum value by choosing feasible solution

- A greedy algorithm is an algorithm that always tries to find the best solution for each sub-problem with the hopes that this will yield a good solution for the problem as a whole.
- A greedy algorithm always makes the choice that looks best at that moment.
- While solving the problems using this technique at each step the choice made must be :
 - Feasible : Satisfying problem's constraints
 - Locally optimal : It has to be best local choice among all feasible choices available.
 - Irrevocable : Once the choice is made, it should not be changed in subsequent steps of the algorithm.

The greedy method suggests that one can devise an algorithm that works in stages, considering one input at a time. At each stage, a decision is made regarding whether a particular input is in an optimal solution. This is done by considering the inputs in an order determined by some selection procedure. If the inclusion of the next input into the partially constructed optimal solution will result in an infeasible solution, then this input is not added to the partial solution. Otherwise, it is added. The selection procedure itself is based on some optimization measure. This measure may be the objective function. In fact, several different optimization measures may be plausible for a given problem. Most of these, however, will result in algorithms that generate suboptimal solutions. This version of the greedy technique is called the subset paradigm.

Greedy Method Algorithm



Coin change problem Statement

- A customer buys items valued less than 50 rupees and gives a 50 rupees note to the cashier (shopkeeper)
- Now, cashier wish to return remaining change to the customer with minimum number of coins available
- The cashier constructs the change in stages using greedy method
- In each stage increase the total amount of change constructed by as much as possible

Coin Change Problem Example

- Suppose customer buys items valued 39 rupees and gives 50 rupees note to cashier
- Then cashier needs to return 11 rupees change back to customer
- Also assume unlimited denominations of 1, 2, 5 and 10 rupees are available with cashier
- Then possible solutions to return remaining change i.e. 11 rupees back to customer will be-
- Solution 1 10 + 1 = 11 and it takes 2 coins
- Solution 2 5 + 5 + 1 = 11 and it takes 3 coins
- Solution3 5 + 2 + 2 + 1 + 1 = 11 and it takes 5 coins

Coin Change Problem Example

- Similarly N solutions are possible to solve above example
- Among N solutions, Solution1 will be optimal solution because it takes only 2 coins
- Also Solution1 achieved the objective of coin change problem i. e. to return 11 rupees change back to customer

Knapsack Problem

KNAPSACK PROBLEM STATEMENT • 4.3 KNAPSACK PROBLEM

Let us try to apply the greedy method to solve the knapsack problem. We are given *n* objects and a knapsack or bag. Object *i* has a weight w_i and the knapsack has a capacity *m*. If a fraction x_i , $0 \le x_i \le 1$, of object *i* is placed into the knapsack, then a profit of $p_i x_i$ is earned. The objective is to obtain a filling of the knapsack that maximizes the total profit earned. Since the knapsack capacity is *m*, we require the total weight of all chosen objects to be at most *m*. Formally, the problem can be stated as

$$\text{maximize} \sum_{1 \le i \le n} p_i x_i \tag{4.1}$$

subject to $\sum_{1 \le i \le n} w_i x_i \le m$ (4.2)

and $0 \le x_i \le 1$, $1 \le i \le n$ (4.3)

The profits and weights are positive numbers. A feasible solution (or filling) is any set (x_1, \ldots, x_n) satisfying (4.2) and (4.3) above. An optimal solution is a feasible solution for which (4.1) is maximized.

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Knapsack Problem

Objective:-

filling of knapsack(bag) that maximizes the total profit earned

Constraint:-

- Total weight of all chosen object must be less than or equal to knapsack capacity m
- 2. Profits(Pi) and Weights(Wi) are positive integers

Example 4.1 Consider the following instance of the knapsack problem: $n = 3, m = 20, (p_1, p_2, p_3) = (25, 24, 15), \text{ and } (w_1, w_2, w_3) = (18, 15, 10).$ Four feasible solutions are:

Of these four feasible solutions, solution 4 yields the maximum profit. As we shall soon see, this solution is optimal for the given problem instance. \Box

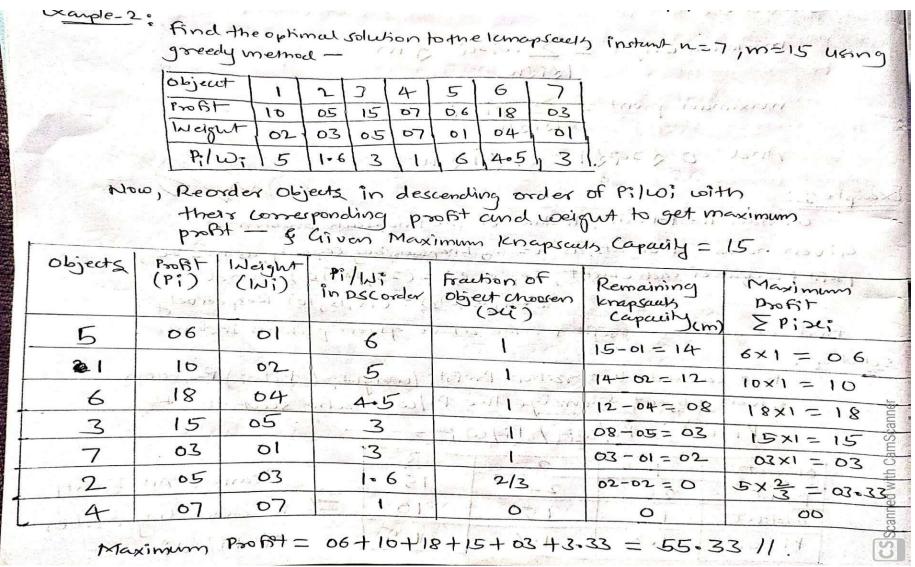
void GreedyKnapsack(float m, int n)
// p[1:n] and w[1:n] contain the profits and weights
// respectively of the n objects ordered such that
// p[i]/w[i] >= p[i+1]/w[i+1]. m is the knapsack
// size and x[1:n] is the solution vector.

for (int i=1; i<=n; i++) x[i] = 0.0; // Initialize x.
float U = m;
for (i=1; i<=n; i++) {
 if (w[i] > U) break;
 x[i] = 1.0;
 U -= w[i];
}
if (i <= n) x[i] = U/w[i];</pre>

Knapsack Problem Example

- Consider the following instance of the knapsack problem:
- Number of Objects(n) = 7
- Knapsack Capacity(m) = 15
- Profits(p1,p2,p3,p4,p5,p6,p7) = (10,5,15,7,6,18,3)
- Weights(w1,w2,w3,w4,w5,w6,w7) = (2,3,5,7,1,4,1)
- Find the optimal solution. i.e. maximum profit

KNAPSACK PROBLEM EXAMPLE SOLUTION



JOB SEQUENCING WITH DEADLINES

Problem Statement

- We are given a set of n jobs.
- Each job is associated with an integer deadline di ≥ 0 & a profit pi > 0.
- For any job i the profit pi is earned iff the job is completed by its deadline.
- To complete a job, one has to process the job on a machine for one unit of time.
- Only one machine is available for processing jobs.
- The objective is to find the subset J of jobs such that each job in this subset can be completed by its deadline & maximum profit will be earned.

What is the deadline of a Job?

Jobs	J1	J2	J3	J4
Profits	100	50	25	75
Deadlines	2	1	4	3

- Assume all jobs takes 1 hour to complete its processing
- Suppose machine starts processing a jobs at 8am then job(J1) needs to complete its processing within 10am because job(J1) has a deadline of 2 hour
- job(J2) needs to complete its processing within 9am because job(J2) has a deadline of 1 hour

JOB SEQUENCING WITH DEADLINES

OBJECTIVES:

To obtain feasible solution with maximum profit value

CONSTRAINTS:

- 1. Only one machine is available for processing all jobs
- 2. Only one unit of time is assigned to complete a job on a machine

High Level Description Algorithm

- Algorithm GreedyJob (d, J, n)
- // J is a set of Jobs that can be completed by their deadlines
 J = {1}
 for i = 2 to n do
 {
 if (all Jobs in J U {i} can be completed by their deadlines)
 }
 }

```
J = J U {i}
```

```
Algorithm JS(d, J, n)
 //d[i] \ge 1, 1 \le i \le n are the deadlines.
 // The jobs are ordered such that p[1] \ge p[2] \ge \dots \ge p[n].
 //J[i] is the ith job in the optimal solution, 1 \le i \le k.
 // Also at termination d[J[i]] \leq d[J[i+1]], 1 \leq i \leq k.
 begin
 d[0] \leftarrow J[0] \leftarrow 0
 J[1] ← 1
 pf \leftarrow p[1]
 k ← 1
for i ← 2 to n do
begin
       r ← k
       while ( (d[J[r]] > d[i]) and (d[J[r]] \neq r)) do
       r ← r -1
       end while
       if ( (d[J[r]] \leq d[i]) \text{ and } (d[i] > r) ) then
       {
              for q \leftarrow k to (r+1) step -1 do
              J[q+1] \leftarrow J[q]
              end for
              J[r+1] ← i
              pf \leftarrow pf + p[i]
              k ← k +1
       }
       end for
       return k
end
```

The Method

Step 1 : Arrange the profit's of jobs & its concerned deadlines in non-increasing order.Step 2 : Apply the algorithm steps one after the other.

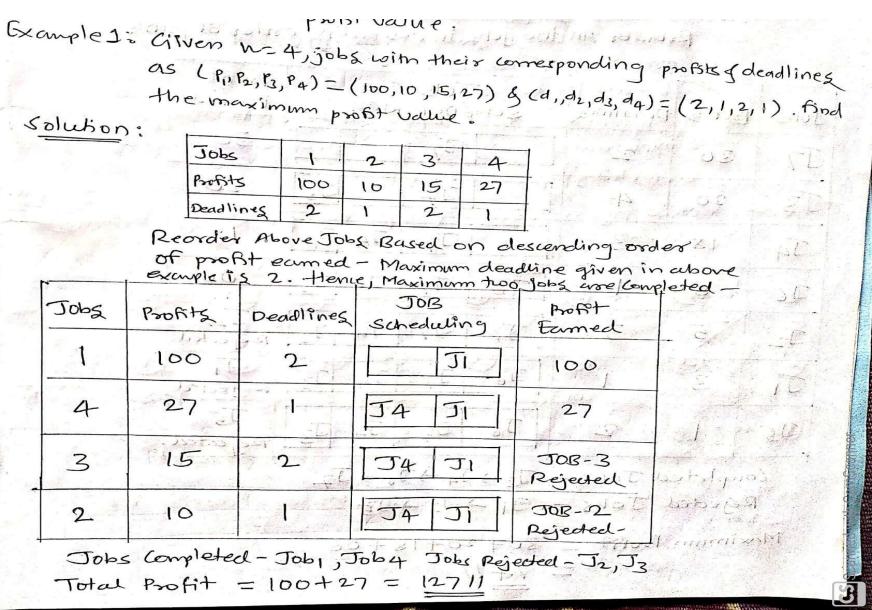
JOB SEQUENCING WITH DEADLINES EXAMPLE-1

.1. Example-3 Solve bolow example of Job Sequencing With Dead Using Greedy Method -Jobs 1-3 1900 Anna ... 2100 Profits 10:51 20 15 Deadlines 2 2 :122 Zien.

Solution: Maximum deadline given is 3, Hence, maximum 3 jobs will be completed out of 5 jobs. Now, Reorder All the jobs in descending order of profits in a how trule chown below -

Jobs	Profits	Deadlines	JOB		Profit- Eamed	
JI	20	- 2	- April a	71	55 1000	120-2
J2	-15-	221101=	52	1 -21	and a second	15
53	(arto	A I G	52	57	i ili	J3 Rejected
54	1.05	33	52	7.5	54	05
55	301 252	3	52	7,	54	J5 Dejected
Jo	b complet	eel - J,	, 52	54	- 20 - 20 - 20 - 20 - 20 - 20 - 20 - 20	The second second
	ob Rejea			free at 1	and the second section	Same
Ma	cimum Pr	off = 2	0+15	+ 05	1. 1. 1. 1. 1. 1. 1. 1. 1. 1. 1. 1. 1. 1	and the
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JOB SEQUENCING WITH DEADLINES EXAMPLE-2



Steps

- Step 01 : Sort all the given jobs in decreasing order of their profit.
- Step-02:
 - Check the value of maximum deadline.
 - Draw a Gantt Chart where the maximum time on the Gantt chart is the value of maximum deadline.
- Step-03:
 - Pick up the jobs one by one.
 - Put the job on Gantt chart as far as possible from 0 ensuring that the job gets completed before the deadline.

Job Sequencing with Deadlines Problem

Let n =6,

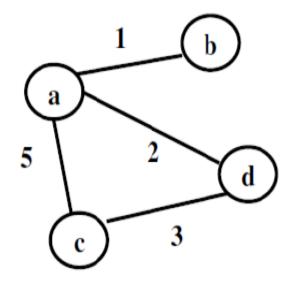
- (p1,p2,p3,p4,p5,p6)=(200,180,190,300,120,100) and (d1,d2,d3,d4,d5,d6)=(5,3,3,2,4,2)
- Answer the following questions:
 - Write the optimal schedule that gives maximum profit.
 - Are all the jobs completed in the optimal schedule?
 - What is the maximum earned profit?

Spanning Tree Minimum Cost Spanning Tree

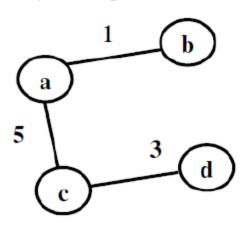
Spanning Tree

• **Definition:** Spanning tree is a connected acyclic sub-graph (tree) of the given graph (G) that includes all of G's vertices.

Example : Consider the following graph



The spanning trees for the above graph are :



a b5 2 dc c

1

Weight $(T_2) = 8$

a b c d d

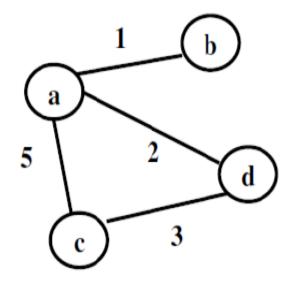
Weight $(T_3) = 6$

Weight $(T_1) = 9$

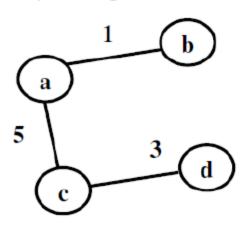
Minimum Spanning Tree (MST)

• **Definition:** MST of a weighted, connected graph G is defined as: A spanning tree of G with minimum total weight.

Example : Consider the following graph

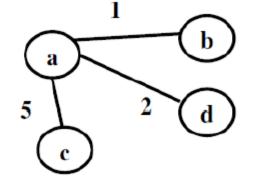


The spanning trees for the above graph are :

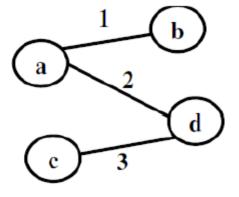


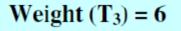
Weight $(T_1) = 9$

1 - 1



Weight $(T_2) = 8$





- Two algorithms are used to generate minimum Cost Spanning Tree :
 - Prim's Algorithm
 - Kruskal's Algorithm

Prim's Algorithm

- Fringe edge: An edge which has one vertex is in partially constructed tree Ti and the other is not.
- **Unseen edge:** An edge with both vertices not in Ti.

Algorithm

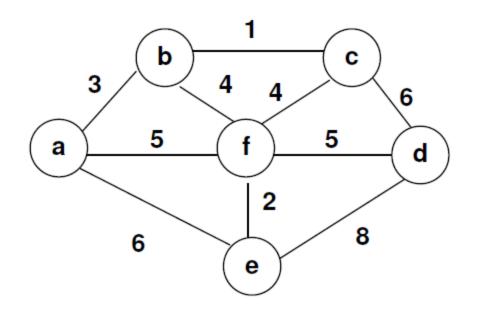
Algorithm Prim (G) //Prim's algorithm for constructing a MST //Input: A weighted connected graph $G = \{V, E\}$ //Output: ET the set of edges composing a MST of G // the set of tree vertices can be initialized with any vertex $V_{T} \leftarrow \{v_{0}\}$ $E_{\tau} \leftarrow O$ for i \leftarrow 1 to |V| - 1 do Find a minimum-weight edge $e^* = (v^*, u^*)$ among all the edges (v, u) such that v is in V_T and u is in V – V_T $V_{T} \leftarrow V_{T} \cup \{ u^{*} \}$ $E_{T} \leftarrow E_{T} \cup \{e^*\}$ return E_⊤

The Method:

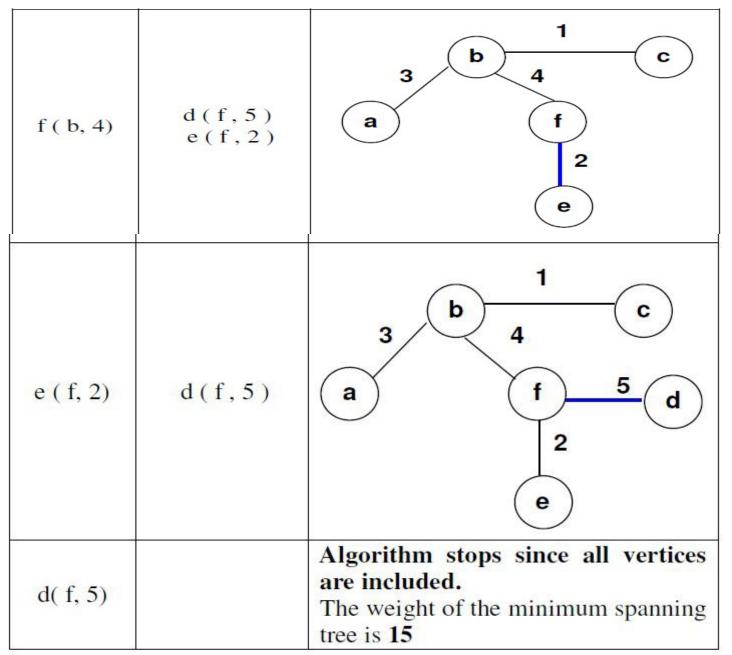
- Step 1 : Start with a tree, T₀ , consisting of one vertex
- Step 2 : "Grow" tree one vertex/edge at a time
 - Construct a series of expanding sub-trees T1, T2, ...
 Tn-1
 - At each stage construct Ti + 1 from Ti by adding the minimum weight edge connecting a vertex in tree (Ti) to one vertex not yet in tree, choose from "fringe" edges (this is the "greedy" step!)
 - Algorithm stops when all vertices are included

Example:

• Apply Prim's algorithm for the following graph to find MST.



Tree vertices	Remaining vertices	Graph
a (-, -)	b(a,3) $c(-,\infty)$ $d(-,\infty)$ e(a,6) f(a,5)	a b
b (a, 3)	c(b,1) $d(-,\infty)$ e(a,6) f(b,4)	3 b c a
c (b, 1)	d(c,6) e(a,6) f(b,4)	a b 1 c a f



Example:

• Apply Prim's algorithm for the following graph to find MST.

PRIM'S ALGORITHM EXAMPLE-2

Grauple 2: Apply prims Algorithm for below given gruph of Find cost of minimum spanning tree MINH & ESTOP J FY 1-12115-1 Martharles 265-1248-111 4 5 12.468 Saus is degle 114 : Englis IV 41.5 1 DUDIE ET d 4 1 FEE CALIFORT CONTRACTOR Marshands (1) Steries 12 TO 143.00 Solution Charles studios ET ETU: 22 ant asilities 1.10 Initialized with 1 255 11 Econory Proved vertex 6 rutitor (b) 251 1 Friday Contension (b) a Step-1 Step-3 1.32 sat subs 1. -----6 TI I CERNINGS grad proticipation and C (d) 1 PEA Step-5 mathinga PLACE FILLE STATESTI Step-4 Paristaks E. 1 25 1 17 mm (ost = N(T) = 3+4+2+4 1115 12: 11 isting alarge Tim La ante prograda - is iden in the periodices and in M Scanned with CamScanner

Kruskal's Algorithm

Algorithm

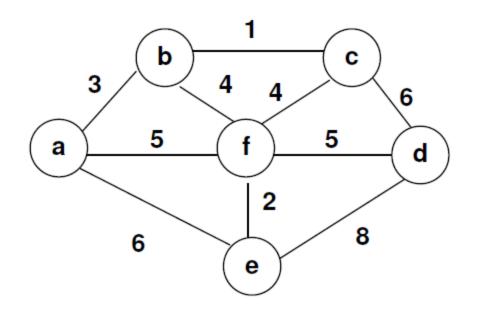
```
Algorithm Kruskal (G)
//Kruskal's algorithm for constructing a MST
//Input: A weighted connected graph G = { V, E }
//Output: E_{\tau} the set of edges composing a MST of G
Sort E in ascending order of the edge weights
E_{\tau} \leftarrow \emptyset
ecounter \leftarrow 0 // initialize the set of tree edges and its size
k \leftarrow 0
                  //initialize the number of processed edges
while ecounter < |V| - 1
k \leftarrow k + 1
if E_T \cup \{e_{ik}\} is acyclic
E_{T} \leftarrow E_{T} \cup \{e_{ik}\}
ecounter \leftarrow ecounter + 1
return E<sub>T</sub>
```

The Method

- Step 1 : Sort the edges by increasing weight
- Step 2 : Start with a forest having |V| number of trees.
- Step 3 : Number of trees are reduced by ONE at every inclusion of an edge
- At each stage:
 - Among the edges which are not yet included, select the one with minimum weight AND which does not form a cycle.
 - The edge will reduce the number of trees by one by combining two trees of the forest.
 - Algorithm stops when |V| -1 edges are included in the MST i.e : when the number of trees in the forest is reduced to ONE.

Example:

• Apply Kruskal's algorithm for the following graph to find MST.



• The list of edges :

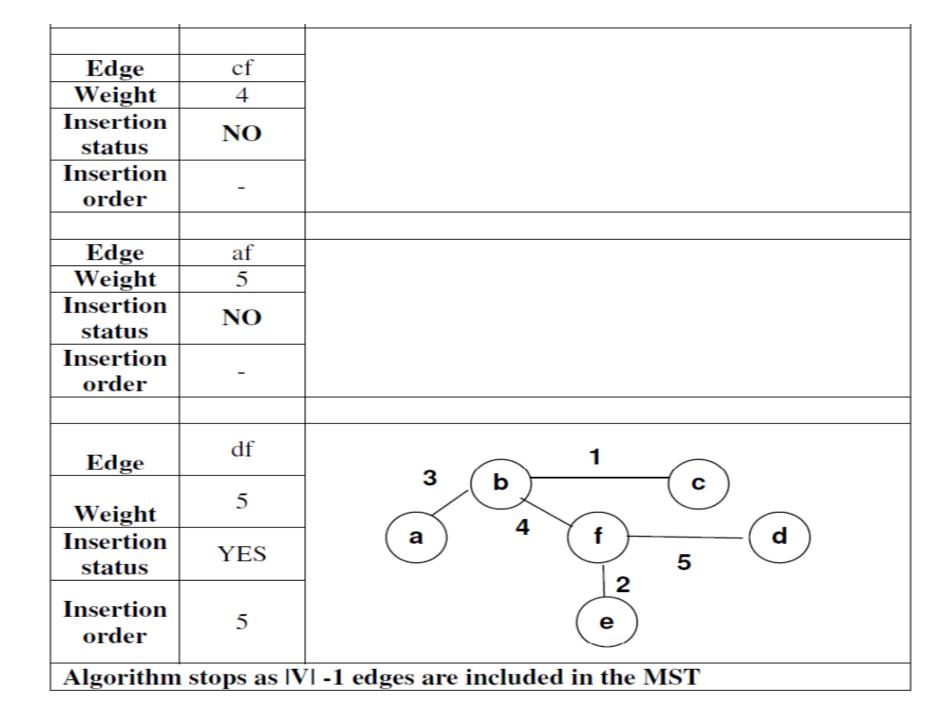
Edge	ab	af	ae	bc	bf	cf	cd	df	de	ef
Weight	3	5	6	1	4	4	6	5	8	2

• Sort the edges in ascending order :

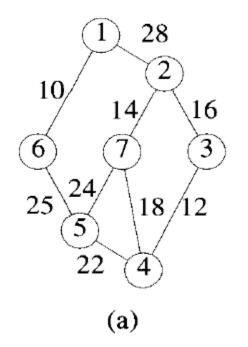
Edge	bc	ef	ab	bf	cf	af	df	ae	cd	de
Weight	1	2	3	4	4	5	5	6	6	8

Edge Weight Insertion status Insertion order	bc 1 YES 1	a f d e
Edge	ef	b c
Weight	2	
Insertion status	YES	
Insertion order	2	e

Edge	ab	3 (b) 1 (c)
Weight	3	(a) (f) (d)
Insertion status	YES	
Insertion order	3	e
Edge	bf	3 b c
Weight	4	a 4 f d
Insertion status	YES	
Insertion order	4	e



• Apply Kruskal's algorithm for the following graph to find MST.



• The list of edges :

Edge	1,2	1,6	2,3	2,7	3,4	6,5	7,4	7,5	4,5
Weight	28	10	16	14	12	25	18	24	22

• Sort the edges in ascending order :

Edge	1,6	3,4	2,7	2,3	7,4	4,5	7,5	6,5	1,2
Weight	10	12	14	16	18	22	24	25	28

Edge	1,6	10/2
Weight	10	
Insertion Status	Yes	5
Insertion Order	1	4
Edge	3,4	
Weight	12	10 2
Insertion Status	Yes	
Insertion Order	2	(5) (12) (4)

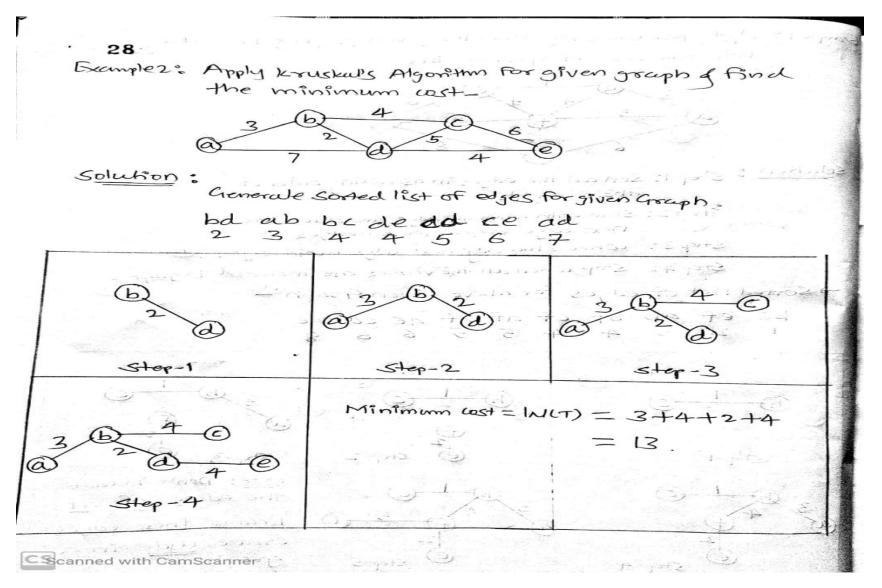
Edge	2,7
Weight	14
Insertion Status	Yes
Insertion Order	3
Edge	2,3
Weight	16
Insertion Status	Yes
Insertion Order	4

Edge	7,4	
Weight	18	
Insertion Status	No	
Insertion Order		
Edge	4,5	
Weight	22	$10 \qquad 12 \qquad 10 \qquad 14 \qquad 16$
Insertion Status	Yes	
Insertion Order	5	$ \begin{array}{c} 5\\ 22\\ 4 \end{array} $

Edge	7,5
Weight	24
Insertion Status	No
Insertion Order	
Edge	5,6
Weight	25
Insertion Status	Yes
Insertion Order	6
Algorithm Stops as	V - 1 edge

Minimum Cost (MST) = 10+12+14+16+22+25

KRUSKAL'S ALGORITHM EXAMPLE-2



Single Source Shortest Path

Dijkstra's Algorithm

SINGLE SOURCE SHORTEST PATH PROBLEM

- It is a problem in which, consider one source vertex in a given weighted connected graph and find shortest paths to all its other vertices from source vertex
- That is to generate separate paths from source vertex to remaining vertex of shortest distance.
- Dijkstra's algorithm is the best-known algorithm used to solve single source shortest-paths problem.

Algorithm

```
Algorithm Dijkstra(G, s)
//Input: Weighted connected graph G and source vertex s
//Output: The length Dv of a shortest path from s to v and its penultimate
vertex Pv for every vertex v in V
for every vertex v in V do
D_v \leftarrow \infty
P_v \leftarrow null // Pv, the parent of v
d_{\varsigma} \leftarrow 0
V_{\tau} \leftarrow \emptyset
for i \leftarrow 0 to |V| - 1 do
V_{T} \leftarrow V_{T} \cup \{u^{*}\}
for every vertex u in V - V_{T} that is adjacent to u<sup>*</sup> do
if Du* + w (u*, u) < Du
Du \leftarrow Du + w (u^*, u)
Pu \leftarrow u^*
```

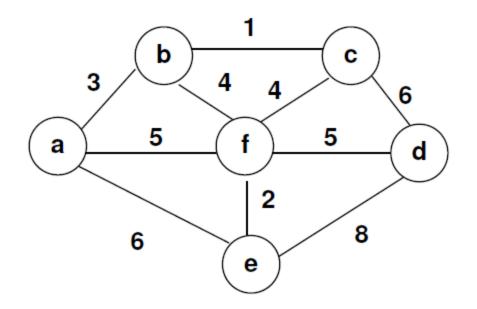
The Method :

Dijkstra's algorithm solves the single source shortest path problem in 2 stages.

- Stage 1 : A greedy algorithm computes the shortest distance from source to all other nodes in the graph and saves in a data structure.
- Stage 2 : Uses the data structure for finding a shortest path from source to any vertex v.
 - 1. At each step, and for each vertex x, keep track of a "distance" D(x) and a directed path P(x) from root to vertex x of length D(x).
 - 2. Scan first from the root and take initial paths P(r, x) = (r, x) with
 - D(x) = w(rx) when rx is an edge,
 - $D(x) = \infty$ when rx is not an edge.
 - 3. For each temporary vertex y distinct from x, set D(y) = min{ D(y), D(x) + w(xy) }

Example:

• Apply Dijkstra's algorithm to find Single source shortest paths with vertex a as the source.



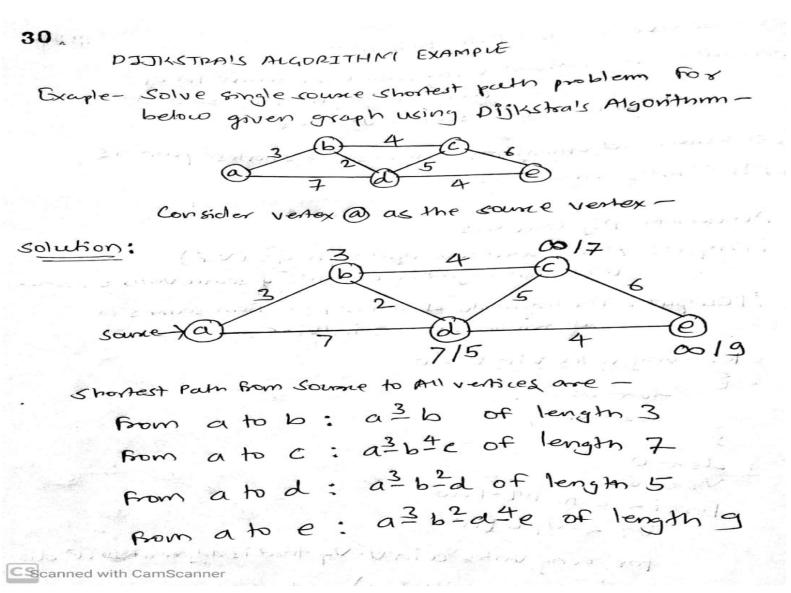
Nodes	Tree Vertices	Remaining vertices	Graph
{a}	a (-, 0)	$b(a,3)c(-,\infty)d(-,\infty)e(a,6)f(a,5)$	a
{a,b}	b (a, 3)	c (b, 3+1) d(-,∞) e (a, 6) f(a, 5)	b 3 a
{a,b,c}	c (b, 4)	d(c,4+6) e(a,6) f(a,5)	a b c c

f (a, 5)	d (c , 10) e (a , 6)	b 1 c
		a f
e (a, 6)	d (c, 10)	b 1 c
		a 5 f
		6 e
d(c, 10)		b 1 c
		a 5 f d
		6 e
-		e (a, 6) d (c, 10)

Example:

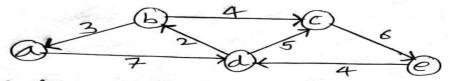
• Apply Dijkstra's algorithm to find Single source shortest paths with vertex a as the source.

Dijkstra's Algorithm – Example1



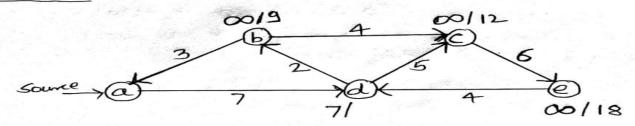
Dijkstra's Algorithm – Example2

DJJKSTRAM'S ALGORITHM EXAMPLE



Find single source shortest path For above given graph

Solution:



Shortest Path From source @ to all vertices -

From a to b - a I d Z b of length g From aloc - a 7 d 5 c of length 12 For a tod - a Z d of length 7 from a to e - a Z d 5 c 6 e of length 18 Scanned with CamScanner

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Huffman Trees & Codes

Huffman Coding

- Huffman coding is lossless data compression technique widely used while transmitting data over network or storing data on the disk
- Huffman coding assigns codeword's of different lengths to different characters. Hence, it is a variable-length encoding technique
- Fixed-length encoding assigns codeword's of same length to different characters

Fixed Length Vs. Variable Length

Fixed Length Encoding Example:

- Assume 4 characters A, B, C, D are given
- Then minimum 3-bits are required to encode all 4-characters
- Each character are represented by using 3-bits as shown below-A=000, B=001, C=010, D=011
- Hence final codeword results as-000 001 010 011
- Total 12 bits are used to encode 4characters A, B, C, D
- It takes more time to transfer data over network
- Also takes more storage space to save data on disk

Variable Length Encoding Example:

- Assume 4 characters A, B, C, D are given
- Then different length bits are used to encode all 4-characters
- Each character are represented by using variable length bits as shown below- A=00, B=001, C=10, D=111
- Hence final codeword results as-00 001 10 111
- Only 10 bits are used to encode 4charactes A, B, C, D
- It takes less time to transfer data over network
- Also takes less storage space to save data on disk

Huffman algorithm to Construct Huffman Tree

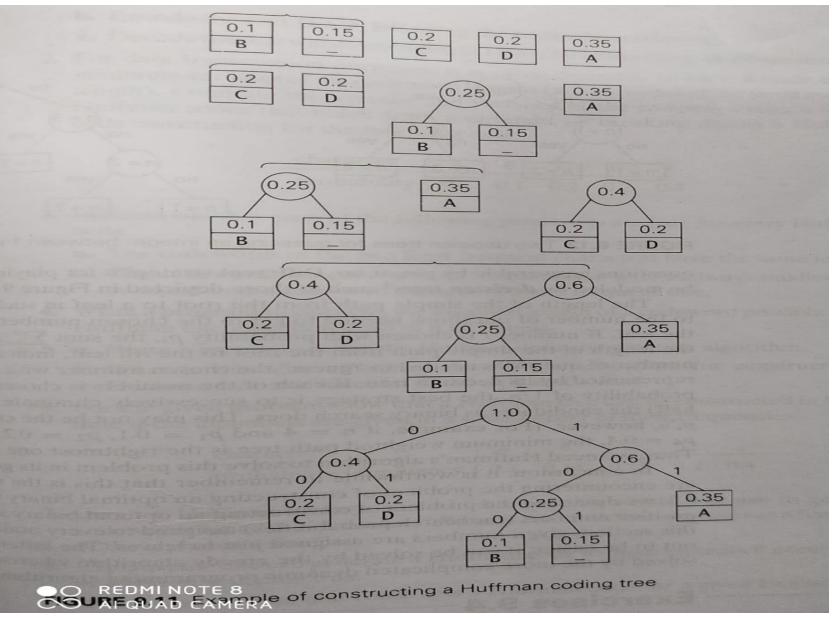
- Step 1:- Initialize n one-node trees and label them with the characters of the alphabet. Record the frequency of each character in its tree's root to indicate the tree's weight
- Step 2:- Repeat the following operation until a single tree is obtained. Find two trees with the smallest weight and make them the left and right subtree of new tree and record the sum of their weights in the root of new tree as its weight

A tree constructed by the above algorithm is called a *Huffman tree*. It defines—in the manner described—a *Huffman code*. **EXAMPLE** Consider the five character of the tree to the second seco

EXAMPLE Consider the five-character alphabet {A, B, C, D, _} with the following occurrence probabilities:

character	A	В	С	D	archo:	
probability	0.35	0.1	0.2	0.2	0.15	

The Huffman tree construction for this input is shown in Figure 9.11. The resulting codewords are as follows:



Encoding & Decoding

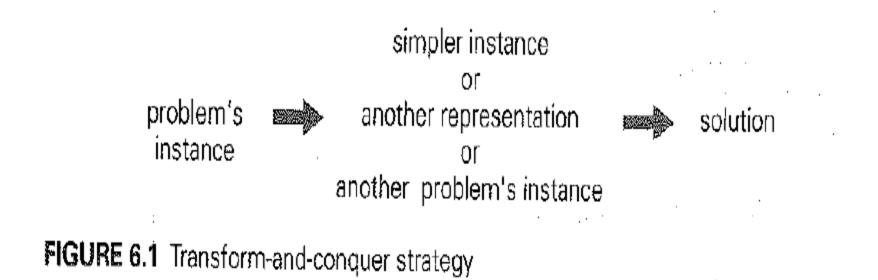
aracter	A	В	С	D	
probability codeword	0.35	0.1	0.2	0.2	0.15
codeword	11	100	00	01	101

- From above table, now characters DAD is encoded as 01 11 01
- BAD is encoded as 100 11 01
- Similarly codeword 100 11 01 101 11 01 101 101 is decoded as BAD_AD

Transform and Conquer

The General Method

- It deals with a group of design methods that are based on the idea of transformation.
- These methods work as two-stage procedures.
 - First, in the transformation stage, the problem's instance is modified to be, for one reason or another, more amenable to solution.
 - Then, in the second or conquering stage, it is solved.

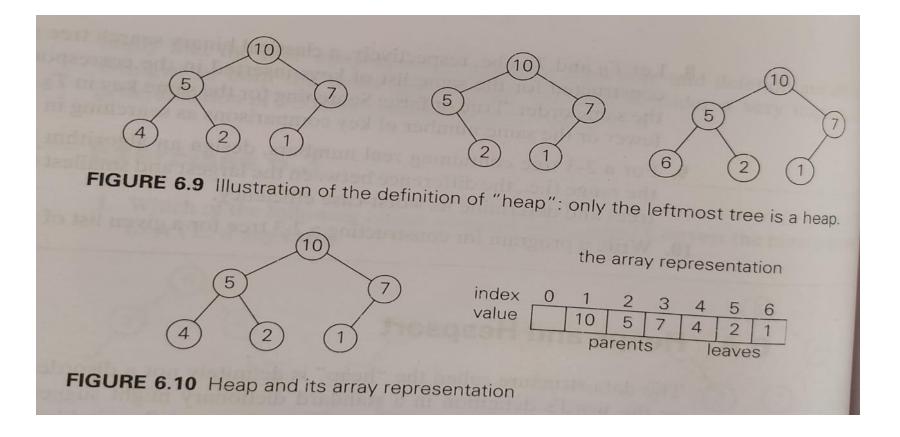


Major Variations of Transform and Conquer

- There are three major variations of this idea that differ by what we transform a given instance to
 - transformation to a simpler or more convenient instance of the same problem-we call it instance simplification
 - transformation to a different representation of the same instance-we call it representation change
 - transformation to an instance of a different problem for which an algorithm is already available-we call it problem reduction

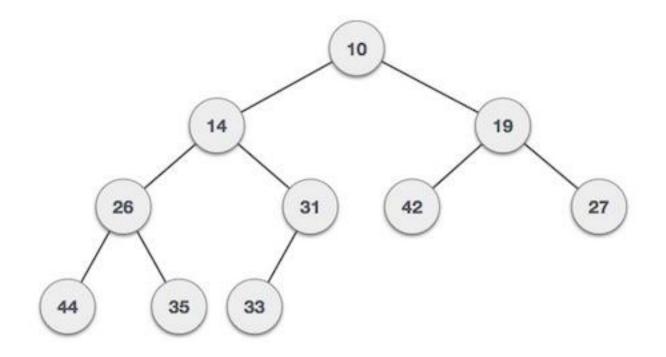
Heap Definition

- A heap can be defined as a BINARY TREE with keys assigned to its each nodes that satisfies following two conditions-
- Condition 1: The Binary Tree shape Requirement
 - BT is complete BT, that is, all its levels are full expect last level, where only some rightmost leaves may be missing
- Condition 2: The Parental dominance Requirement
 - The key at each parent node is greater than or equal to the keys at its children. It is called as Max heap.
 - The key at each parent node is less than or equal to the keys at its children. It is called as Min heap.



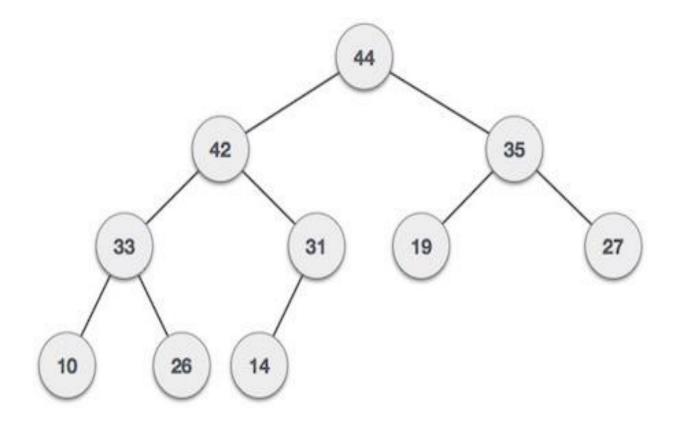
Min Heap Example

For Input → 35, 33, 42, 10, 14, 19, 27, 44, 26, 31



Max Heap Example

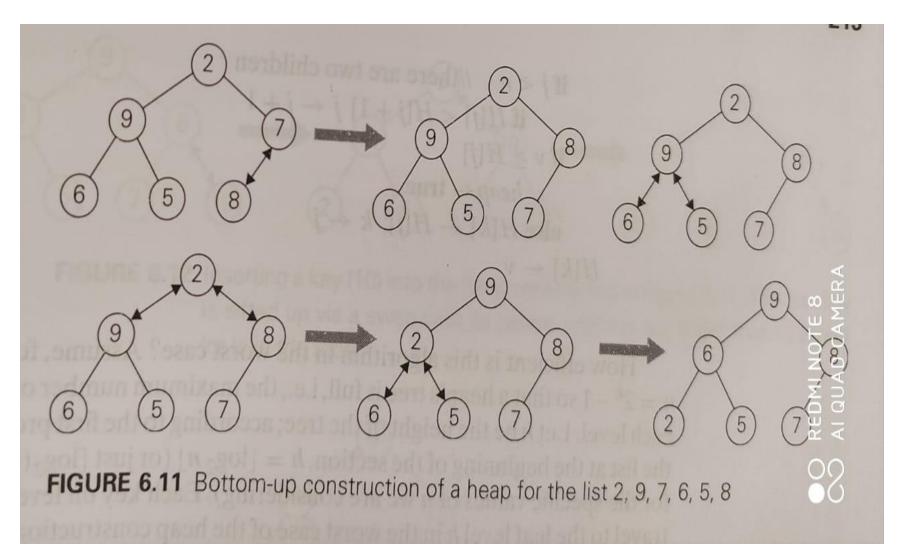
For Input → 35, 33, 42, 10, 14, 19, 27, 44, 26, 31



Max Heap Construction Algorithm

- Step 1 Create a new node at the end of heap.
- Step 2 Assign new value to the node.
- Step 3 Compare the value of this child node with its parent.
- Step 4 If value of parent is less than child, then swap them.
- Step 5 Repeat step 3 & 4 until Heap property holds.

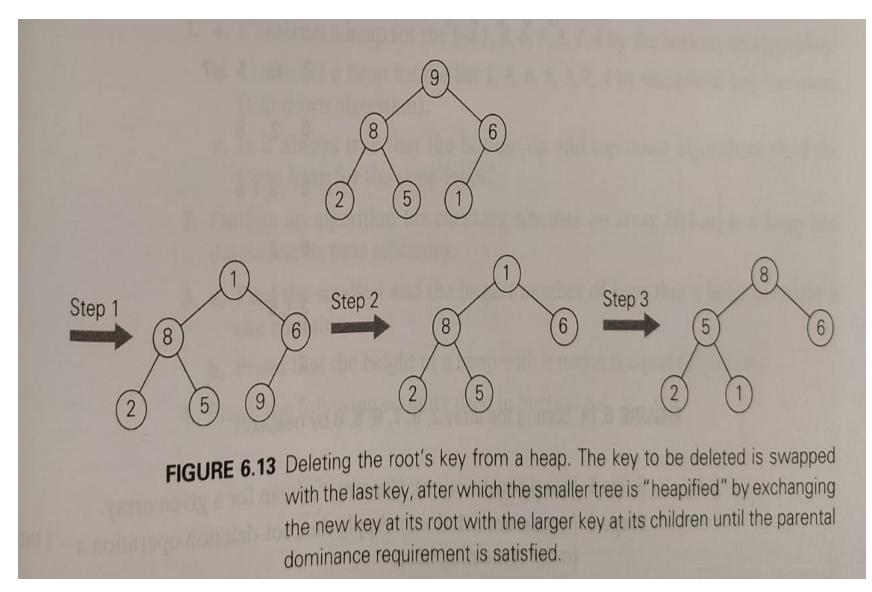
Bottom-Up Heap Construction



Max Heap Deletion Algorithm

- **Step 1** Remove root node.
- Step 2 Move the last element of last level to root.
- Step 3 Compare the value of this child node with its parent.
- Step 4 If value of parent is less than child, then swap them.
- Step 5 Repeat step 3 & 4 until Heap property holds.

Maximum Key Deletion from a Heap



Heapsort Algorithm

- Heapsort algorithm has two stages as shown below-
- stage 1: Heap Construction

Construct a heap for a given array

stage 2: Maximum Deletion Apply the root deletion operation n-1 times for remaining heap

HeapSort Example

	Stage	1 (h	eap	con	istru	uction)	Stage	2 (m	naxin	num	dele	tions)
	2	9	7	6	5	8	9	6	8	2	5	7
	2	9	8	6	5	7	7	6	8	2	5	9
	2	9	8	6	5	7	8	6	7	2	5	
	9	2	8	6	5	7	5	6	7	2 1	8	
	9	6	8	2	5	7	7	6	5	2		
							2	6	5	7		
							6	2	5			
							5	2	6			
							5	2				
							2	5				
							2					
FIGURE 6.14	Sorti	ng ti	he a	arra	y 2,	9, 7, 6, 5, 8 b	by hea	apso	rt			

• Construct a heap for the list 1, 8, 6, 5, 3, 7, 4 by the bottom-up algorithm.