

Chapter 4

The Greedy Approach



Greedy Approach



- "Scrooge greedily grab as much as gold as he could without considering the past or future."

Greedy Approach

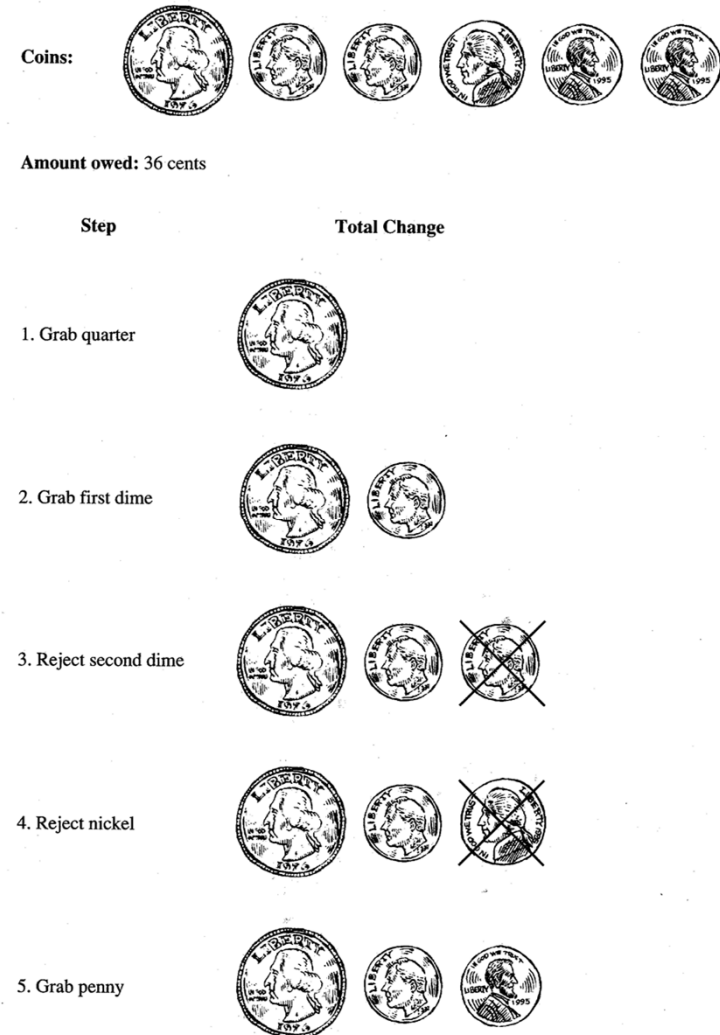
- ❑ The greedy algorithm grabs data items in sequence
 - that is the "best" at the moment according to some criterion
 - without regard for the choices it has made before or will make in the future.

Greedy Approach

❑ Example: Coin Exchange

- There are 1 quarter, 2 dimes, 1 nickel, and 2 pennies. Exchange 36 cents with as smaller number of coins as possible.

Figure 4.1 A greedy algorithm for giving change.



Greedy Approach

❑ Steps in greedy algorithm:

- Greedy algorithm starts with an empty set and adds items to the set ***in sequence*** until the set represents a solution to an instance of a problem:

(1) Selection procedure

- Choose the next "best" item according to some criterion and add it to the set.

(2) Feasibility check

- Determine if the new set is feasible by checking whether it is possible to complete this set in such a way as to give a solution to the instance.
- If it is feasible, then go to next step.
- Otherwise, discard the chosen item at step (1) from the set. Go to step (1)

(3) Solution check

- Determines whether the new set constitutes a solution to the instance.



Greedy Approach

❑ Exchange coins by a greedy algorithm:

While (there are more coins and the instance is not solved) {

Grab the largest remaining coin;	// selection procedure
----------------------------------	------------------------

If (adding the coin makes the change exceed the amount owed)	// feasibility check
--	----------------------

 reject the coin;

else

 add the coin to the change;

If (the total value of the change equals the amount owed)	// solution check
---	-------------------

 the instance is solved;

}

Greedy Approach

❑ Coin exchange problem revisited

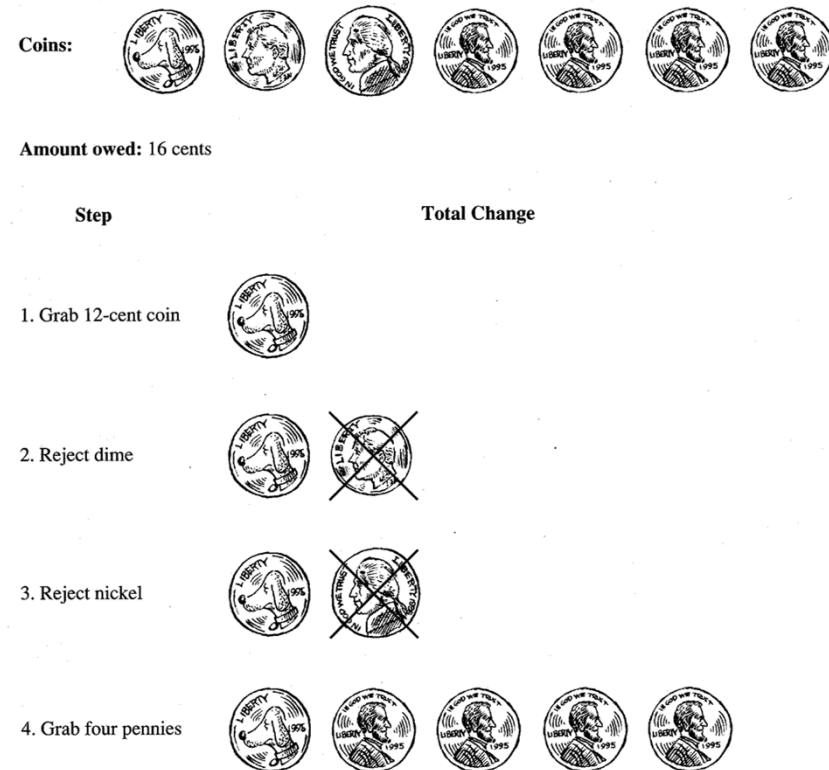
- There are one 12-cent coin, 1 dime, 1 nickels, and 4 pennies. Exchange 16 cents with as smaller number of coins as possible.

- Greedy algorithm gives 5 coins

- We have a solution with 3 coins.

- For general cases, use **dynamic programming**.

Figure 4.2 The greedy algorithm is not optimal if a 12-cent coin is included.



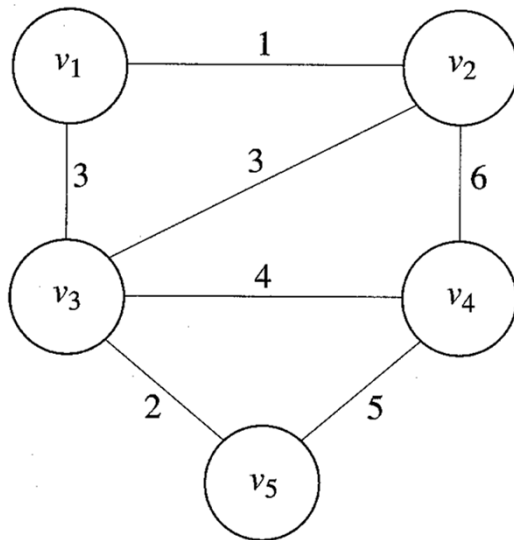
Minimum Spanning Trees

□ Undirected graph $G = (V, E)$

- V : set of vertices
- E : set of edges

□ Example

(a) A connected, weighted, undirected graph G .



$$V = \{v_1, v_2, v_3, v_4, v_5\}$$

$$E = \{(v_1, v_2), (v_1, v_3), (v_2, v_3), (v_2, v_4), (v_3, v_4), (v_3, v_5), (v_4, v_5)\}$$

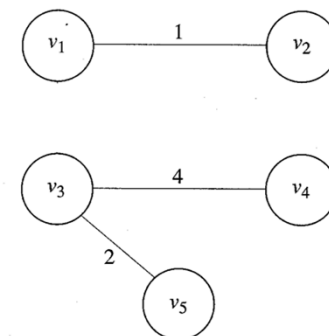
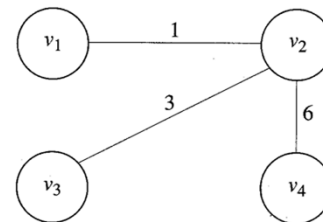
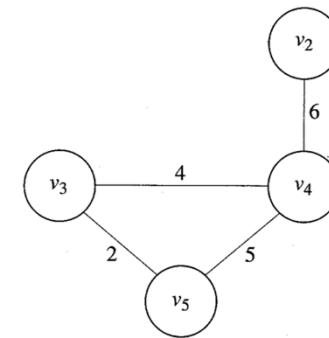
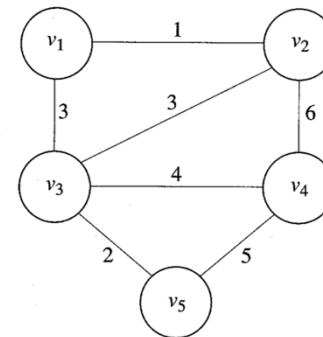
Minimum Spanning Trees

□ Subgraph

■ Subgraph $G'=(V',E')$ of a graph $G=(V,E)$

(1) $V' \subseteq V$

(2) $E' = \{(u,v) \mid u,v \in V'\}$



Minimum Spanning Trees

□ Terms

- **Path**

- An undirected graph is **connected** if there is a path between every pair of vertices

- **Cycle**

- **Cyclic** graph, **Acyclic** graph

- **Tree**

- Tree is an acyclic, connected, undirected graph.

- **Rooted tree**

- Tree with one vertex is singled out as a root.

Minimum Spanning Trees

□ A **spanning tree** for a graph G

- A connected subgraph of G that
 - contains all the vertices of G
 - is a tree

□ **Minimum spanning tree** of G

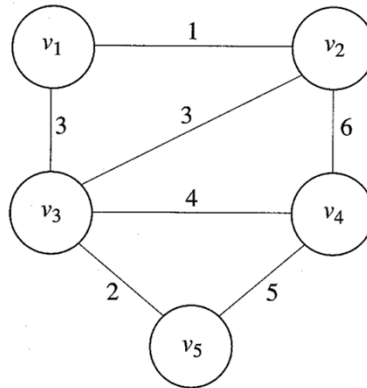
- A spanning tree of G that has the minimum sum of weights.

Minimum Spanning Trees

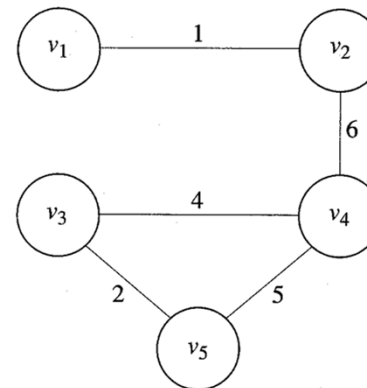
□ Example

Figure 4.3 A weighted graph and three subgraphs.

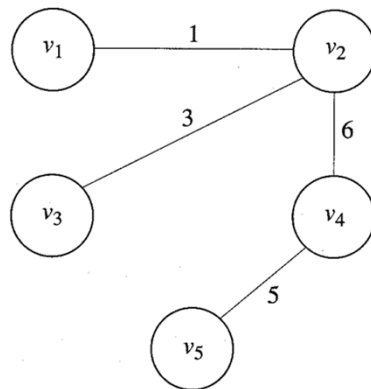
(a) A connected, weighted, undirected graph G .



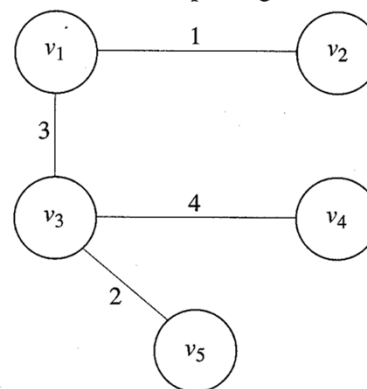
(b) If (v_4, v_5) were removed from this subgraph, the graph would remain connected.



(c) A spanning tree for G .



(d) A minimum spanning tree for G .



Minimum Spanning Trees

❑ Minimum spanning tree (MST) problem

- Given undirected, weighted, connected graph $G=(V,E)$, compute the minimum spanning tree $G'=(V,F)$ of G .

❑ Two greedy algorithms for MST

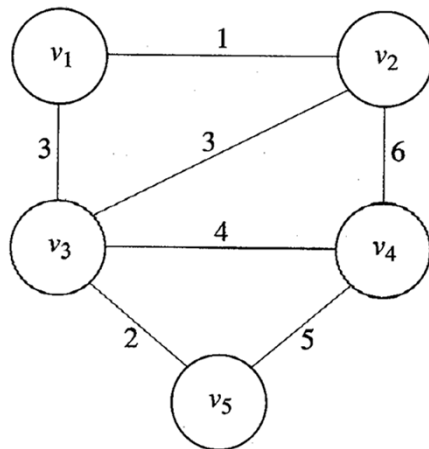
- Prim's algorithm
- Kruskal's algorithm

Prim's Algorithm

□ MST

- Given undirected, weighted, connected graph $G=(V,E)$, compute the minimum spanning tree $G'=(V,F)$ of G .

- For a set $Y \subseteq V$ of vertices, a **nearest** vertex to Y is a vertex in $V-Y$ that is connected to a vertex in Y by an edge of minimum weight.



A vertex nearest to $\{v_1\}$ is v_2

A vertex nearest to $\{v_1, v_2\}$ is v_3

A vertex nearest to $\{v_1, v_2, v_3\}$ is v_5

A vertex nearest to $\{v_1, v_2, v_3, v_5\}$ is v_4

Prim's Algorithm

□ High-level Prim's algorithm

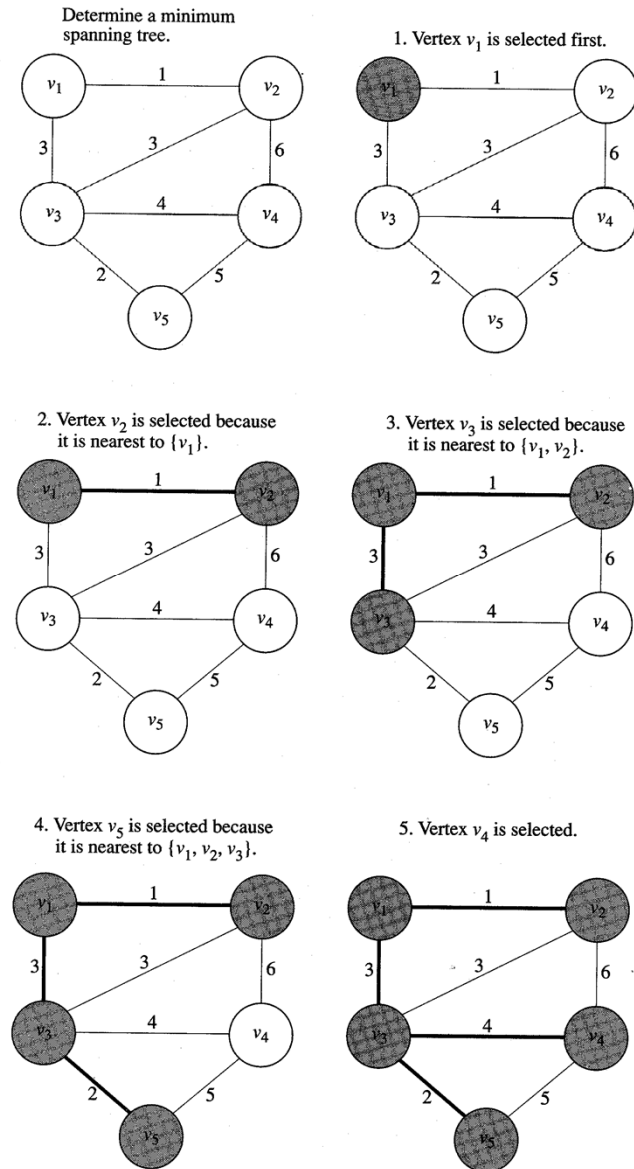
■ Greedy approach

```
 $F = \emptyset;$  // Initialize set of edges to empty.  
 $Y = \{v_1\};$  // Initialize set of vertices to  
// contain only the first one.  
while (the instance is not solved) {  
    select a vertex in  $V - Y$  that is // selection procedure and  
    nearest to  $Y;$  // feasibility check  
    add the vertex to  $Y;$   
    add the edge to  $F;$   
    if ( $Y == V$ ) // solution check  
        the instance is solved;  
}
```

Prim's Algo

□ Example

Figure 4.4 A weighted graph (in upper left corner) and the steps in Prim's Algorithm for that graph. The vertices in Y and the edges in F are shaded at each step.



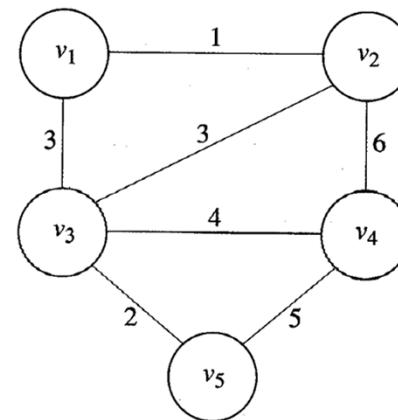
Prim's Algorithm

□ Implementation of Prim's algorithm

■ W : adjacency matrix of G

$$W[i][j] = \begin{cases} \text{weight on edge} & \text{if there is an edge from } v_i \text{ to } v_j \\ \infty & \text{if there is no edge from } v_i \text{ to } v_j \\ 0 & \text{if } i = j \end{cases}$$

	1	2	3	4	5
1	0	1	3	∞	∞
2	1	0	3	6	∞
3	3	3	0	4	2
4	∞	6	4	0	5
5	∞	∞	2	5	0



Prim's Algorithm

□ Implementation of Prim's algorithm

- Arrays : *nearest[]*, *distance[]*

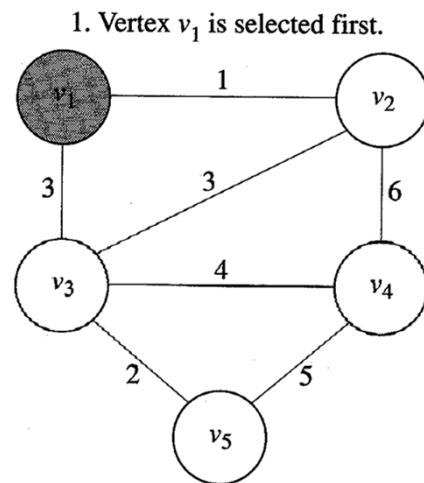
- *nearest[i]* = index of the vertex in Y nearest to v_i

- *distance[i]* = weight on edge between v_i and the vertex indexed by *nearest[i]*.

Prim's Algorithm

□ Running Prim's algorithm

(1) $Y = \{v_1\}$



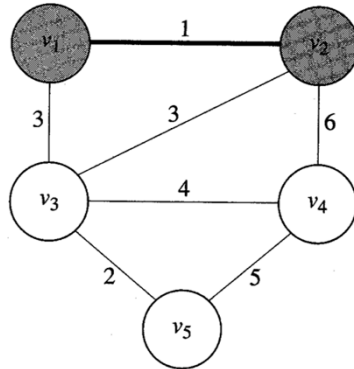
	1	2	3	4	5
nearest		1	1	1	1
distance		1	3	inf	inf

Here, we suppose that vertex 4 and 4 are connected to a vertex 1 by an edge of weight "infinity"

Prim's Algorithm

(2) $Y = \{v_1, v_2\}$

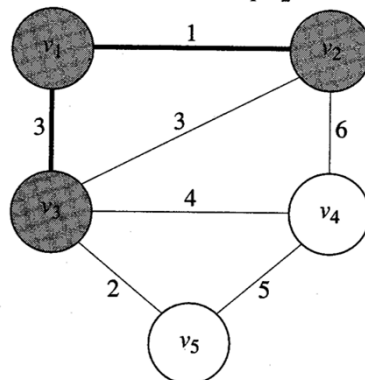
2. Vertex v_2 is selected because it is nearest to $\{v_1\}$.



	1	2	3	4	5
nearest			1	2	1
distance			3	6	inf

(3) $Y = \{v_1, v_2, v_3\}$

3. Vertex v_3 is selected because it is nearest to $\{v_1, v_2\}$.

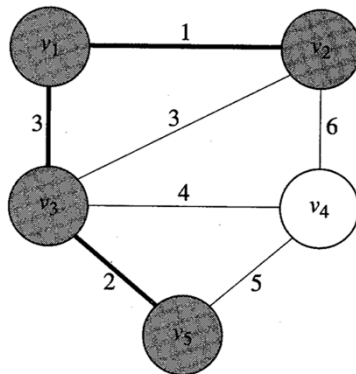


	1	2	3	4	5
nearest				3	3
distance				4	2

Prim's Algorithm

(4) $Y = \{v_1, v_2, v_3, v_5\}$

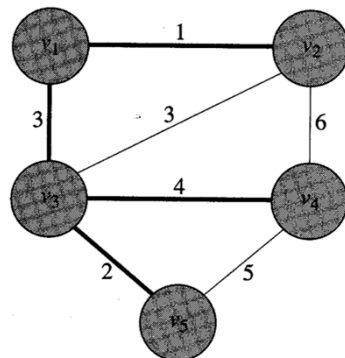
4. Vertex v_5 is selected because it is nearest to $\{v_1, v_2, v_3\}$.



	1	2	3	4	5
nearest				3	
distance				4	

(5) $Y = \{v_1, v_2, v_3, v_5, v_4\}$

5. Vertex v_4 is selected.



	1	2	3	4	5
nearest					
distance					

Prim's Algorithm

```
void prim (int n,  
           const number W[][],  
           set_of_edges& F)  
{  
    index i, vnear;  
    number min;  
    edge e;  
    index nearest[2..n];  
    number distance[2..n];  
  
    F =  $\emptyset$ ;  
    for (i = 2; i <= n; i++) {  
        nearest[i] = 1;  
        distance[i] = W[1][i];  
    }  
  
    // For all vertices, initialize v1  
    // to be the nearest vertex in  
    // Y and initialize the distance  
    // from Y to be the weight  
    // on the edge to v1.
```

Prim's Algorithm

```
repeat (n - 1 times) {
    min = ∞;
    for (i = 2; i ≤ n; i++)
        if (0 ≤ distance[i] < min) {
            min = distance[i];
            vnear = i;
        }
    e = edge connecting vertices indexed
        by vnear and nearest[vnear];
    add e to F;
    distance[vnear] = -1;
    for (i = 2; i ≤ n; i++)
        if (W[i][vnear] < distance[i]) {
            distance[i] = W[i][vnear];
            nearest[i] = vnear;
        }
}
```

// Add all $n - 1$ vertices to Y .

// Check each vertex for
// being nearest to Y .

// Add vertex indexed by
// $vnear$ to Y .

// For each vertex not in Y ,
// update its distance from Y .

Prim's Algorithm

- ☐ Analysis of Prim's algorithm

- ☐ *Skip*

- ☐ Analysis of Prim's algorithm

- ☐ Why Prim's algorithm generates a tree?

- ☐ Why Prim's algorithm generates a minimum spanning tree?

- ☐ *Skip*

Kruskal's Algorithm

□ High-level Kruskal's algorithm

$F = \emptyset;$ // Initialize set of
// edges to empty.

create disjoint subsets of V , one for each
vertex and containing only that vertex;

sort the edges in E in nondecreasing order;

while (the instance is not solved) {

select next edge; // selection procedure

if (the edge connects two vertices in
disjoint subsets) { // feasibility check

merge the subsets;
add the edge to F ;

}

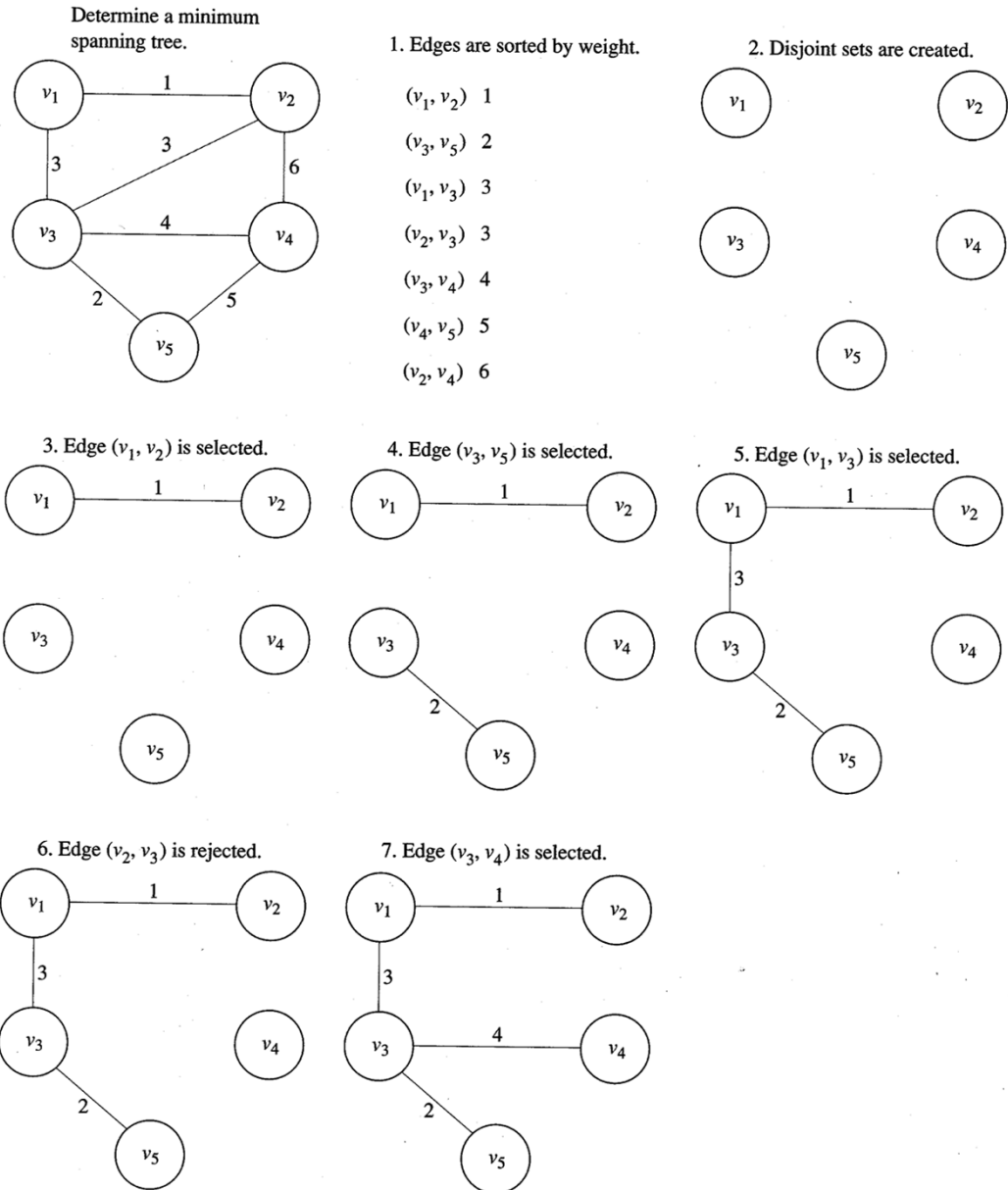
if (all the subsets are merged) // solution check
the instance is solved;

}

Krus

□ Example

Figure 4.7 A weighted graph (in upper left corner) and the steps in Kruskal's Algorithm for that graph.



Kruskal's Algorithm

□ Implementation of Kruskal's Algorithm

```
void kruskal (int n, int m,
             set_of_edges E,
             set_of_edges& F)
{
    index i, j;
    set_pointer p, q;
    edge e;

    Sort the m edges in E by weight in nondecreasing order;
    F =  $\emptyset$ ;
    initial(n); // Initialize n disjoint subsets.
    while (number of edges in F is less than n - 1) {
        e = edge with least weight not yet considered;
        i, j = indices of vertices connected by e;
        p = find(i);
        q = find(j);
        if (!equal(p, q)) {
            merge(p, q);
            add e to F;
        }
    }
}
```

Kruskal's Algorithm

❑ Implementation of Kruskal's Algorithm

- *initial(n) :*
 - *initialize n disjoint subsets, each of which contains exactly one of the indices between 1 and n .*
- *$p = \text{find}(i)$:*
 - *makes p point to the set containing index i .*
- *merge(p, q) :*
 - *merges the two sets, to which p and q point, into the set.*
- *equal(p, q)*
 - *returns true if p and q both point to the same set.*

Kruskal's Algorithm

☐ Analysis of Kruskal's algorithm

- *Skip*

☐ Analysis of Kruskal's algorithm

- Why Kruskal's algorithm generates a tree?
- Why Kruskal's algorithm generates a minimum spanning tree?
- *Skip*

Single-Source Shortest Paths

□ Dijkstra's algorithm

■ High level Dijkstra's algorithm

$Y = \{v_1\};$

$F = \emptyset;$

while (the instance is not solved) {

select a vertex v from $V - Y$, that has a shortest path from v_1 , using only vertices in Y as intermediates;	// selection procedure // and feasibility check
---	--

add the new vertex v to Y ;

add the edge (on the shortest path) that touches v to F ;

if ($Y == V$)

the instance is solved;

// solution check

}

Dijkstra's Algorithm

□ Dijkstra's algorithm is very similar to Prim's algorithm

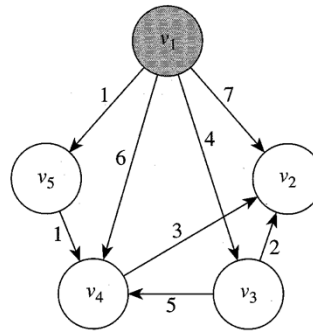
$Y = \{v_1\};$	$F = \emptyset;$	// Initialize set of edges to empty.
$F = \emptyset;$	$Y = \{v_1\};$	// Initialize set of vertices to // contain only the first one.
while (the instance is not solved)	while (the instance is not solved) {	
<div style="border: 1px solid black; padding: 5px;"> select a vertex v from $V - Y$ – shortest path from v_1, using in Y as intermediates; </div>	<div style="border: 1px solid black; padding: 5px;"> select a vertex in $V - Y$ that is nearest to Y; </div>	// selection procedure and // feasibility check
add the new vertex v to Y ;	add the vertex to Y ;	
add the edge (on the short	add the edge to F ;	
if ($Y == V$)	if ($Y == V$)	// solution check
the instance is solved;	the instance is solved;	
}	}	

Dijkstra's Algorithm

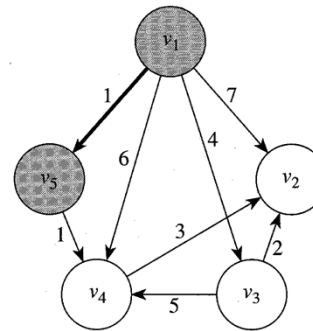
□ Example

Figure 4.8 A weighted, directed graph (in upper left corner) and the steps in Dijkstra's Algorithm for that graph. The vertices in Y and the edges in F are shaded at each step.

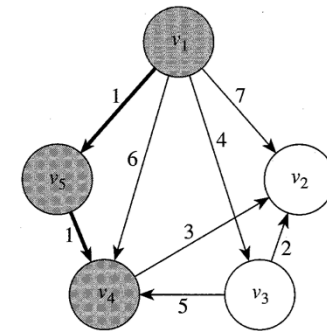
Compute shortest paths from v_1 .



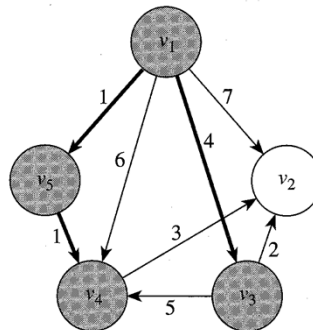
1. Vertex v_5 is selected because it is nearest to v_1 .



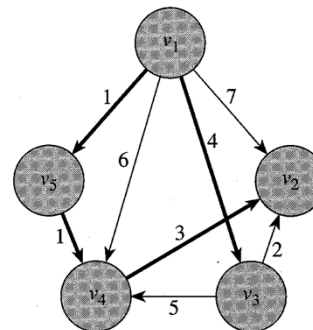
2. Vertex v_4 is selected because it has the shortest path from v_1 using only vertices in $\{v_5\}$ as intermediates.



3. Vertex v_3 is selected because it has the shortest path from v_1 using only vertices in $\{v_4, v_5\}$ as intermediates.



4. The shortest path from v_1 to v_2 is $[v_1, v_5, v_4, v_2]$.



Dijkstra's Algorithm

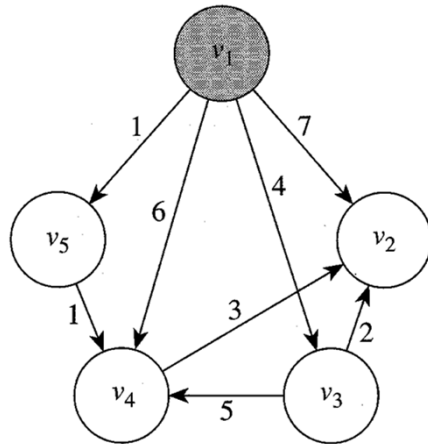
□ Implementation of Dijkstra's algorithm

- Arrays : $touch[]$, $length[]$
- $touch[i] =$ index of vertex v in Y such that the edge $\langle v, v_i \rangle$ is the last edge on the current shortest path from v_1 to v_i using only vertices in Y as intermediates.
- $length[i] =$ length of the current shortest path from v_1 to v_i using only vertices in Y as intermediates

Dijkstra's Algorithm

□ Running Dijkstra's algorithm

(1) $Y = \{v_1\}$

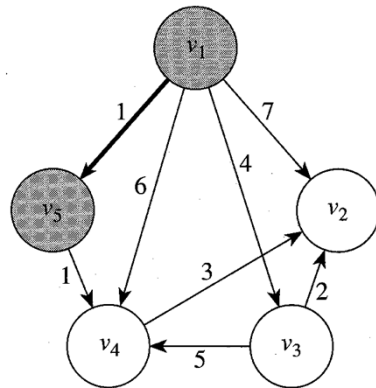


	1	2	3	4	5
touch	1	1	1	1	1
length	0	7	4	6	1

Initially, we set $touch[i] = 1$ and $W[1][i]$ is copied to $length[i]$,

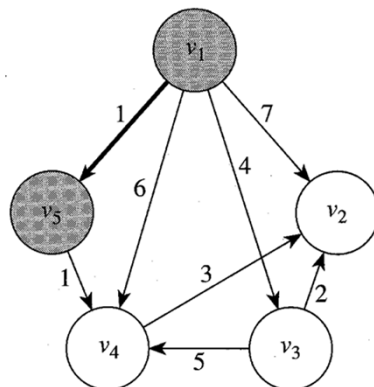
Dijkstra's Algorithm

(2) $Y = \{v_1, v_5\}$



	1	2	3	4	5
touch	1	1	1	5	1
length	0	7	4	2	-1

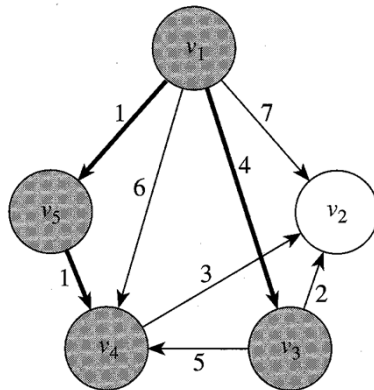
(3) $Y = \{v_1, v_5, v_4\}$



	1	2	3	4	5
touch	1	4	1	5	1
length	0	5	4	-2	-1

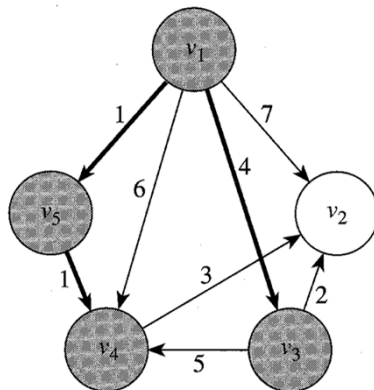
Dijkstra's Algorithm

(4) $Y = \{v_1, v_5, v_4, v_3\}$



	1	2	3	4	5
touch	1	4	1	5	1
length	0	5	-4	-2	-1

(5) $Y = \{v_1, v_5, v_4, v_3, v_2\}$



	1	2	3	4	5
touch	1	4	1	5	1
length	0	-5	-4	-2	-1

```

void dijkstra (int n,
               const number W[ ][ ],
               set_of_edges& F)
{
    index i, vnear;
    edge e;
    index touch[2..n];
    number length[2..n];

    F =  $\emptyset$ ;
    for (i = 2; i <= n; i++) {           // For all vertices, initialize  $v_1$ 
        touch[i] = 1;                     // to be the last vertex on the
        length[i] = W[1][i];              // current shortest path from
    }                                     //  $v_1$ , and initialize length of
                                         // that path to be the weight
                                         // on the edge from  $v_1$ .

    repeat (n - 1 times) {               // Add all  $n - 1$  vertices to  $Y$ .
        min =  $\infty$ ;

        for (i = 2; i <= n; i++)          // Check each vertex for
            if (0 ≤ length[i] < min) {     // having shortest path.
                min = length[i];
                vnear = i;
            }

        e = edge from vertex indexed by touch[vnear]
            to vertex indexed by vnear;
        add e to F;

        for (i = 2; i <= n; i++)
            if (length[vnear] + W[vnear][i] < length[i]) {
                length[i] = length[vnear] + W[vnear][i];
                touch[i] = vnear;          // For each vertex not in  $Y$ ,
            }                             // update its shortest path.

        length[vnear] = -1;               // Add vertex indexed by vnear
                                         // to  $Y$ .
    }
}

```

```

void dijkstra (int n,
               const number W[ ][ ],
               set_of_edges& F)
{
    index i, vnear;
    edge e;
    index touch[2..n];
    number length[2..n];

    F =  $\emptyset$ ;
    for (i = 2; i <= n; i++) {           // For all vertices
        touch[i] = 1;                     // to be the
        length[i] = W[1][i];              // Y and initialize
    }                                     // from Y to
                                         // on the edge

    repeat (n - 1 times) {                // Add all n - 1
        min =  $\infty$ ;
        for (i = 2; i <= n; i++)          // Check each vertex
            if (0  $\leq$  length[i] < min) {    // being nearest
                min = length[i];
                vnear = i;
            }
        e = edge from vertex indexed by touch[vn
        to vertex indexed by vnear;
        add e to F;
        for (i = 2; i <= n; i++)
            if (length[vnear] + W[vnear][i] < length
                length[i] = length[vnear] + W[vnear][i];
                touch[i] = vnear;           // update its distance
            }
        length[vnear] = -1;                // Add vertex i
    }                                     // vnear to Y.
}

```

```

void prim (int n,
           const number W[ ][ ],
           set_of_edges& F)
{
    index i, vnear;
    number min;
    edge e;
    index nearest[2..n];
    number distance[2..n];

    F =  $\emptyset$ ;
    for (i = 2; i <= n; i++) {           // For all vertices
        nearest[i] = 1;                  // to be the
        distance[i] = W[1][i];           // Y and initialize
    }                                     // from Y to
                                         // on the edge

    repeat (n - 1 times) {                // Add all n - 1
        min =  $\infty$ ;
        for (i = 2; i <= n; i++)          // Check each vertex
            if (0  $\leq$  distance[i] < min) {    // being nearest
                min = distance[i];
                vnear = i;
            }
        e = edge connecting vertices indexed
        by vnear and nearest[vnear];
        add e to F;
        distance[vnear] = -1;             // Add vertex i
        for (i = 2; i <= n; i++)          // vnear to Y.
            if (W[i][vnear] < distance[i]) { // For each vertex
                distance[i] = W[i][vnear]; // update its distance
                nearest[i] = vnear;
            }
    }
}

```

Dijkstra's Algorithm

☐ Analysis of Dijkstra's algorithm

☐ *Skip*