

# COT 6936: Topics in Algorithms

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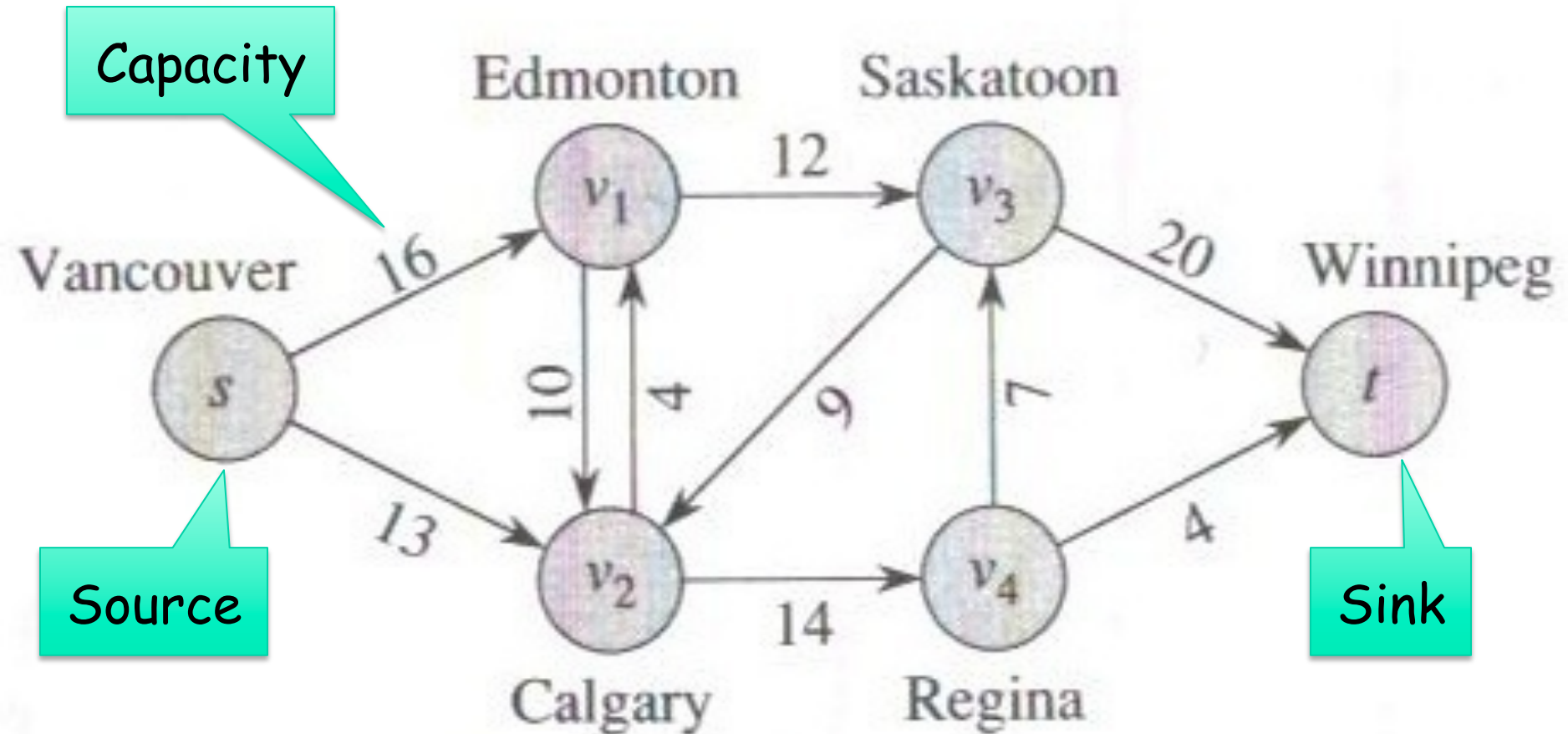
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<https://moodle.cis.fiu.edu/v2.1/course/view.php?id=612>

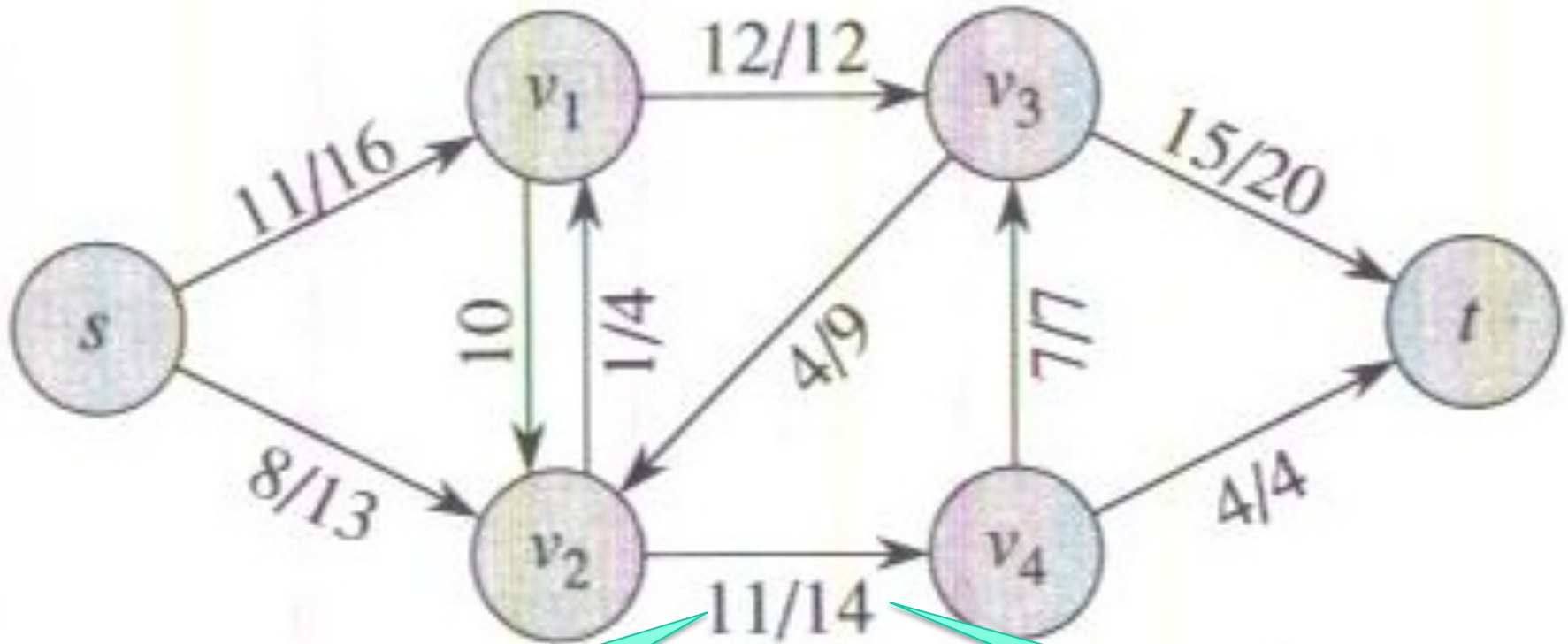
# Types of networks & Types of queries

- Road, highway, rail
- Electrical power, water, oil, gas, sewer
- Internet, phone, wireless, sensor
- ...
  
- (1950s) How quickly can Soviet Union get supplies through its rail network to Europe?
- Which links to destroy to reduce flow to under a threshold?

# Network Flow: Example



# Network Flow: Example of a flow



Flow value along edge

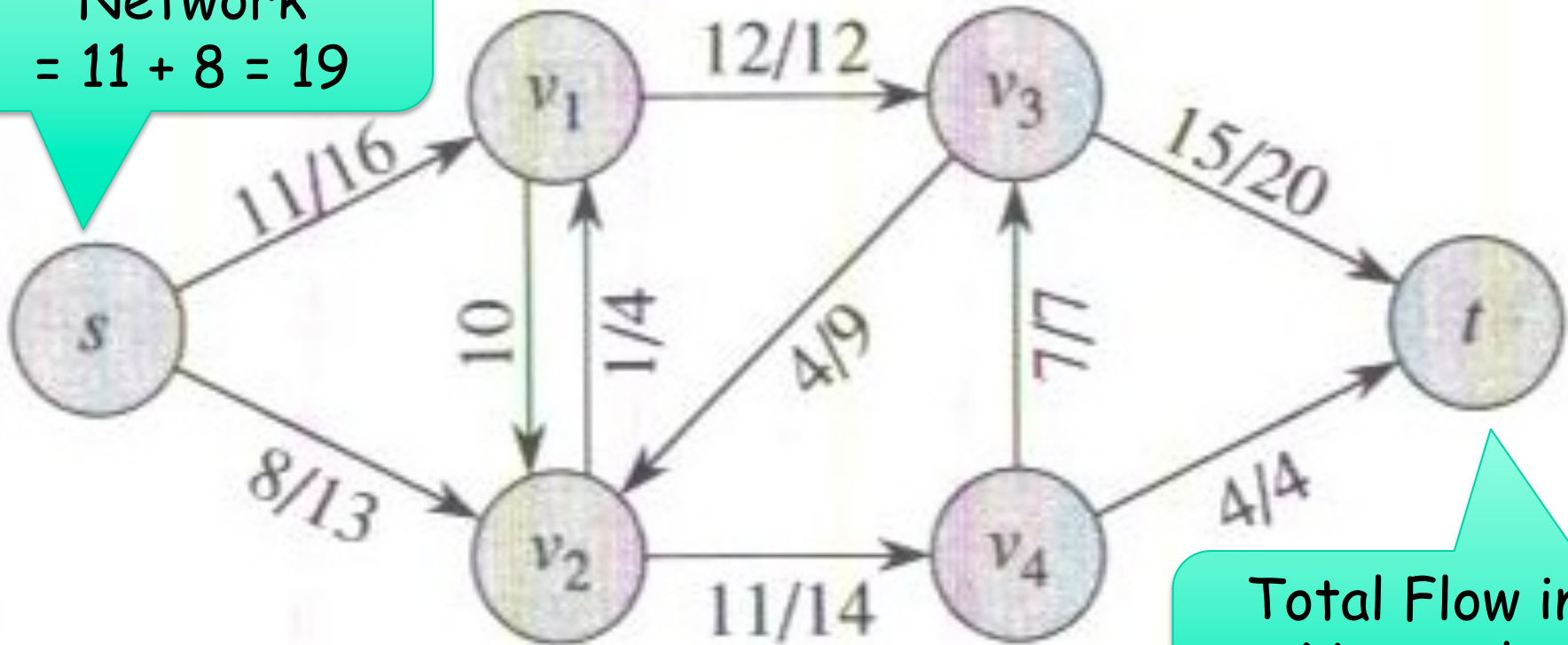
Capacity of edge

# Network Flow

- Directed graph  $G(V,E)$  with capacity function on edges given by non-negative function  $c: E(G) \rightarrow \mathcal{R}^+$ .
  - Capacity of each edge,  $e$ , is given by  $c(e)$
  - Source vertex  $s$
  - Sink vertex  $t$
- Flow function  $f$  is a non-negative function of the edges
  - $f: E(G) \rightarrow \mathcal{R}^+$
  - Capacity constraints:  $f(e) \leq c(e)$
  - Flow conservation constraints: For all vertices except source and sink, sum of flow values along edges entering a vertex equals sum of flow values along edges leaving that vertex
- Flow value: sum of flow values from source vertex (or sum of flow into sink vertex)

# Network Flow: Example of a flow

Total Flow in Network  
 $= 11 + 8 = 19$

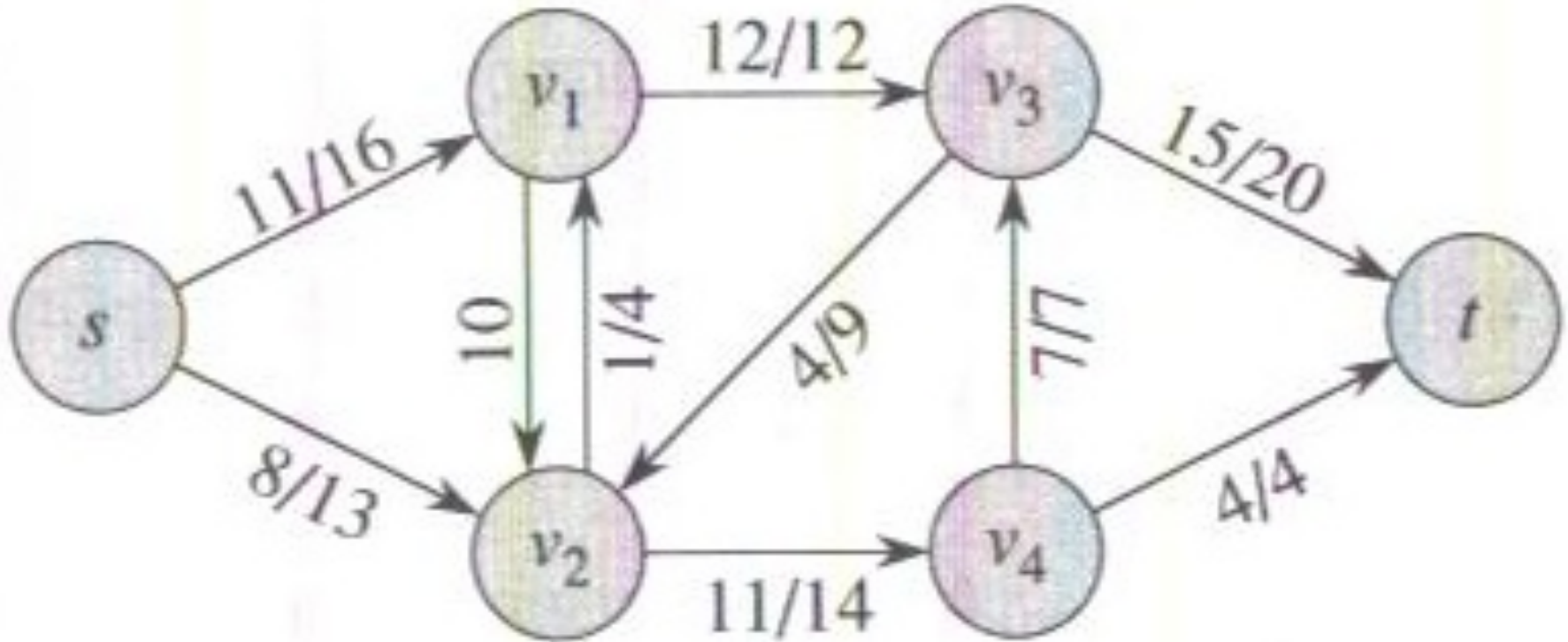


Total Flow in Network  
 $= 15 + 4 = 19$

# Flow Conservation

- For any legal flow function:
  - Flow out of source = Flow into sink (Why?)

# Network Flow: How to increase flow



Find path with residual capacity and increase flow along path.

- Path  $s$  to  $v_1$  to  $v_3$  to  $t$  has no residual capacity
- Path  $s$  to  $v_2$  to  $v_4$  to  $t$  has no residual capacity
- Path  $s$  to  $v_2$  to  $v_1$  to  $v_3$  to  $t$  has no residual capacity



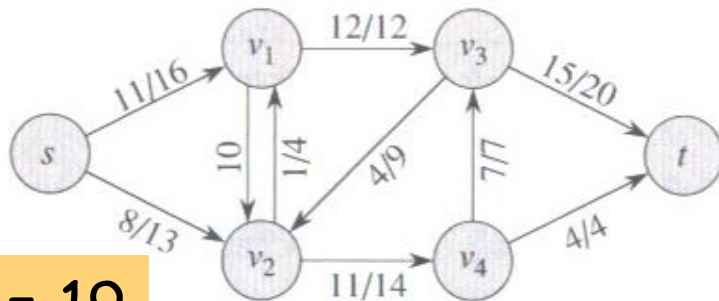
# Max Network Flow Algorithm

- Initialize flow  $f$  to 0.
- While (there exists augmenting path  $p$  from  $s$  to  $t$ ) do
  - Augment flow along augmenting path  $p$
- Return flow  $f$  as maximum flow from  $s$  to  $t$



Incorrect  
Algorithm

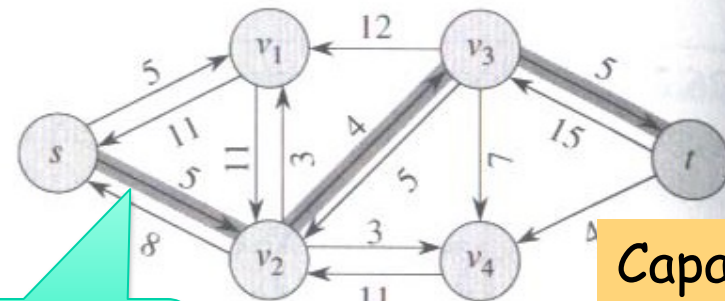
# Residual Flows and Augmenting Paths



Flow = 19

(a)

Augmenting Path



Capacity of augmenting path = 4

(b)

Flow = 23

- Find path with residual capacity and increase flow along path.
- Path  $s$  to  $v_2$  to  $v_3$  to  $t$  had residual capacity

# Residual Flow Network: Definition

- Directed Graph  $G(V,E)$  with capacity function  $c$  and flow function  $f$
- Residual flow network  $G_f(V,E')$ 
  - For every edge  $e = (u,v)$  in  $E$  with  $f(e) < c(e)$ , there are two edges in  $E'$ :  $(u,v)$  and  $(v,u)$  with capacities  $c(e) - f(e)$  and  $f(e)$ , respectively
  - For every edge  $e = (u,v)$  in  $E$  with  $f(e) = c(e)$ , there is one edge in  $E'$ :  $(v,u)$  with capacity  $f(e)$
  - For every edge  $e = (u,v)$  in  $E$  with  $f(e) = 0$ , there is one edge in  $E'$ :  $(u,v)$  with capacity  $f(e)$

# Max Network Flow Algorithm

- Initialize flow  $f$  to 0.
- While (there exists augmenting path  $p$  from  $s$  to  $t$ ) do
  - Augment flow along augmenting path  $p$
- Return flow  $f$  as maximum flow from  $s$  to  $t$

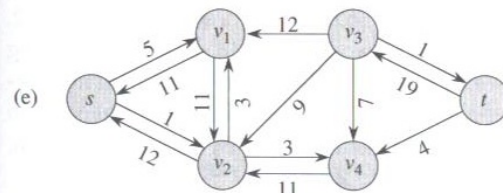
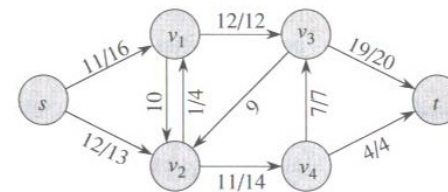
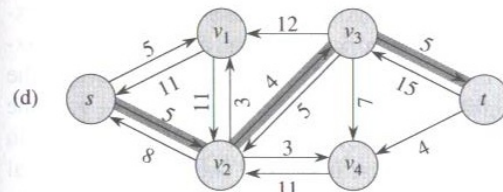
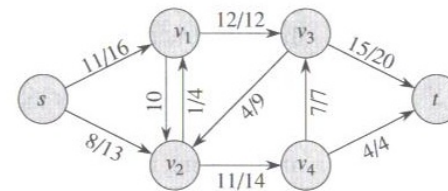
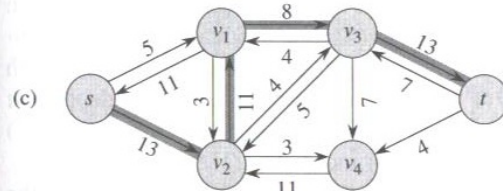
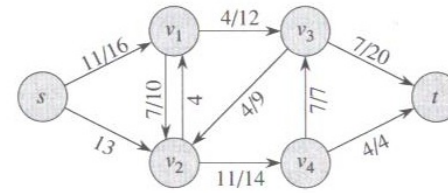
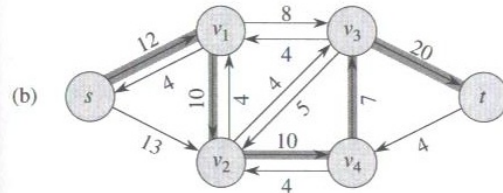
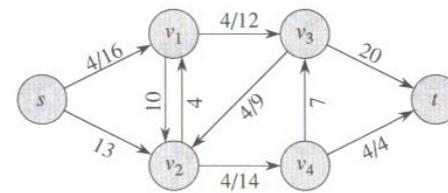
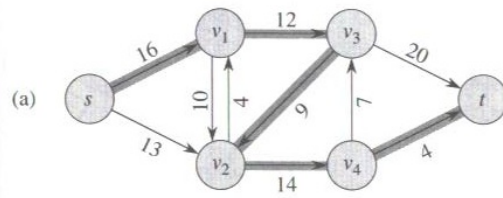


Incorrect  
Algorithm

# Ford Fulkerson Algorithm

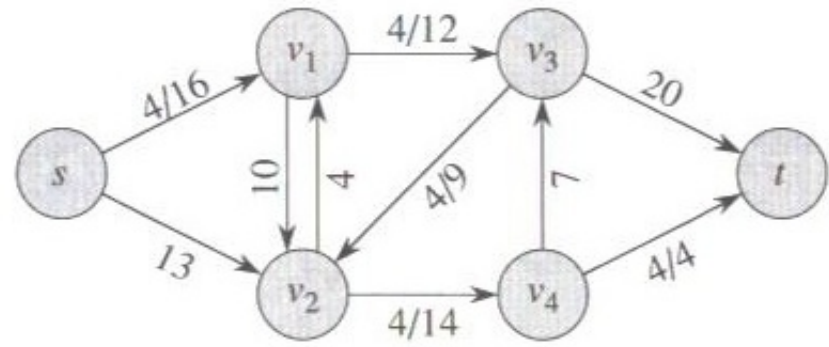
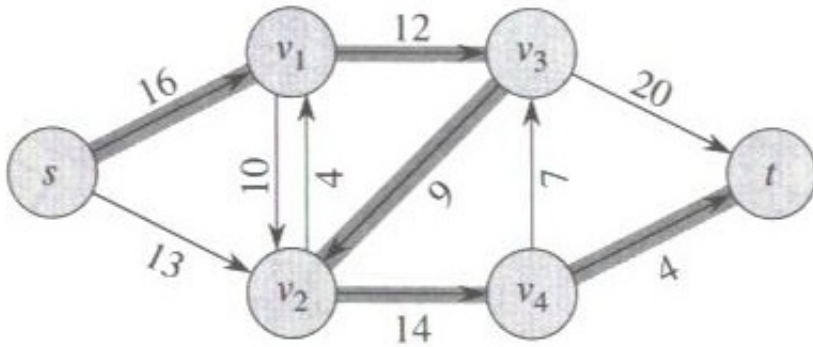
- Initialize flow  $f$  to 0.
- While (there exists directed path  $p$  from  $s$  to  $t$  **in residual flow network  $G_f$** ) do
  - Augment flow along augmenting path  $p$
- Return flow  $f$  as maximum flow from  $s$  to  $t$

# Ford-Fulkerson Method: Example

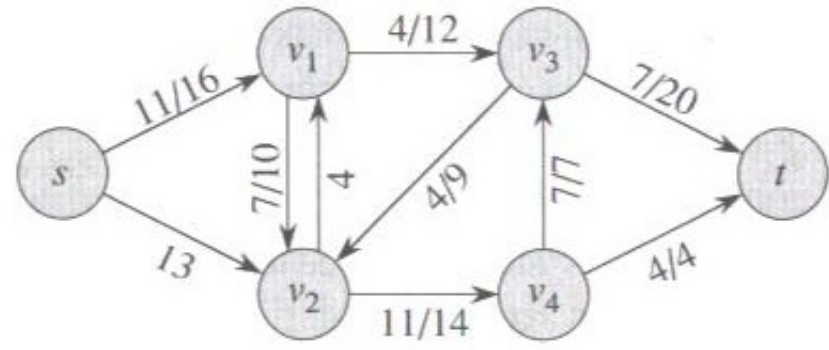
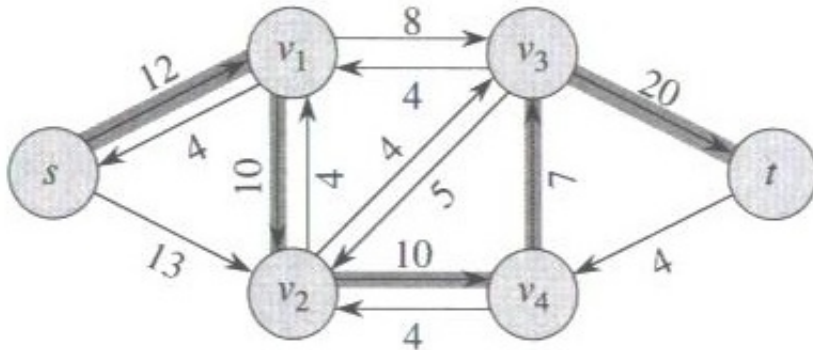


# Ford-Fulkerson Method: Example

A

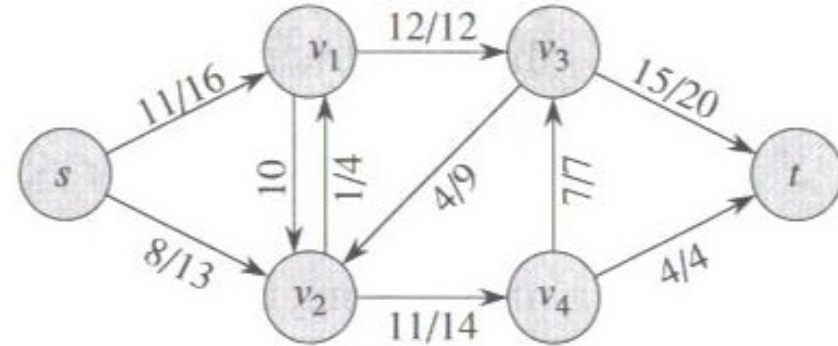
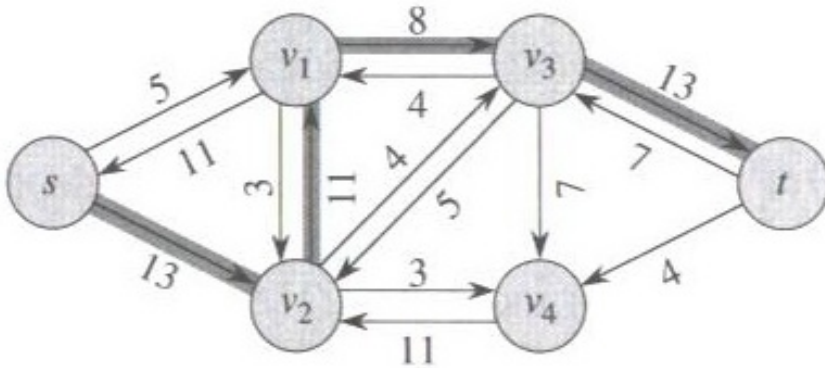


B

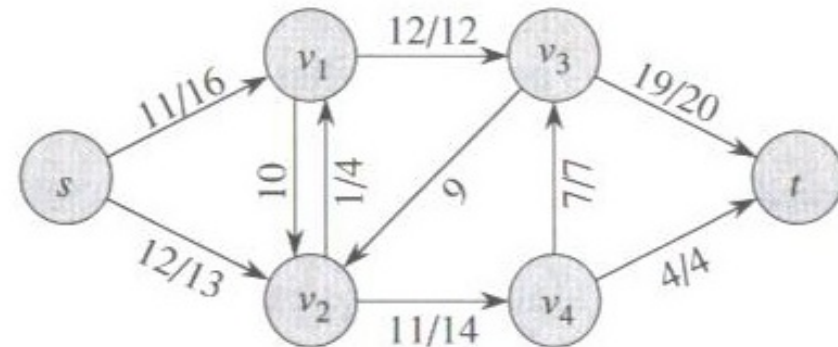
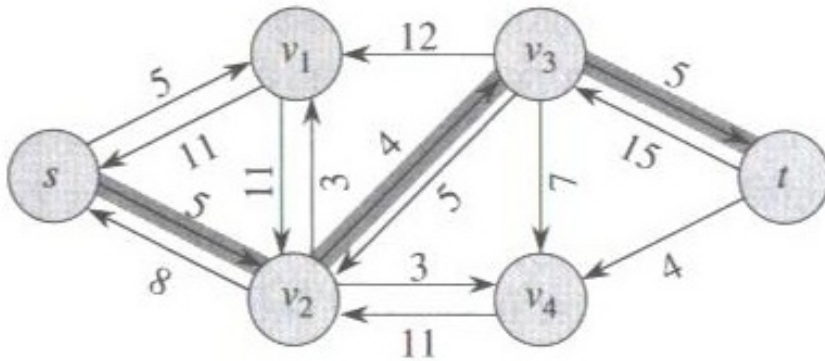


# Ford-Fulkerson Method: Example

C

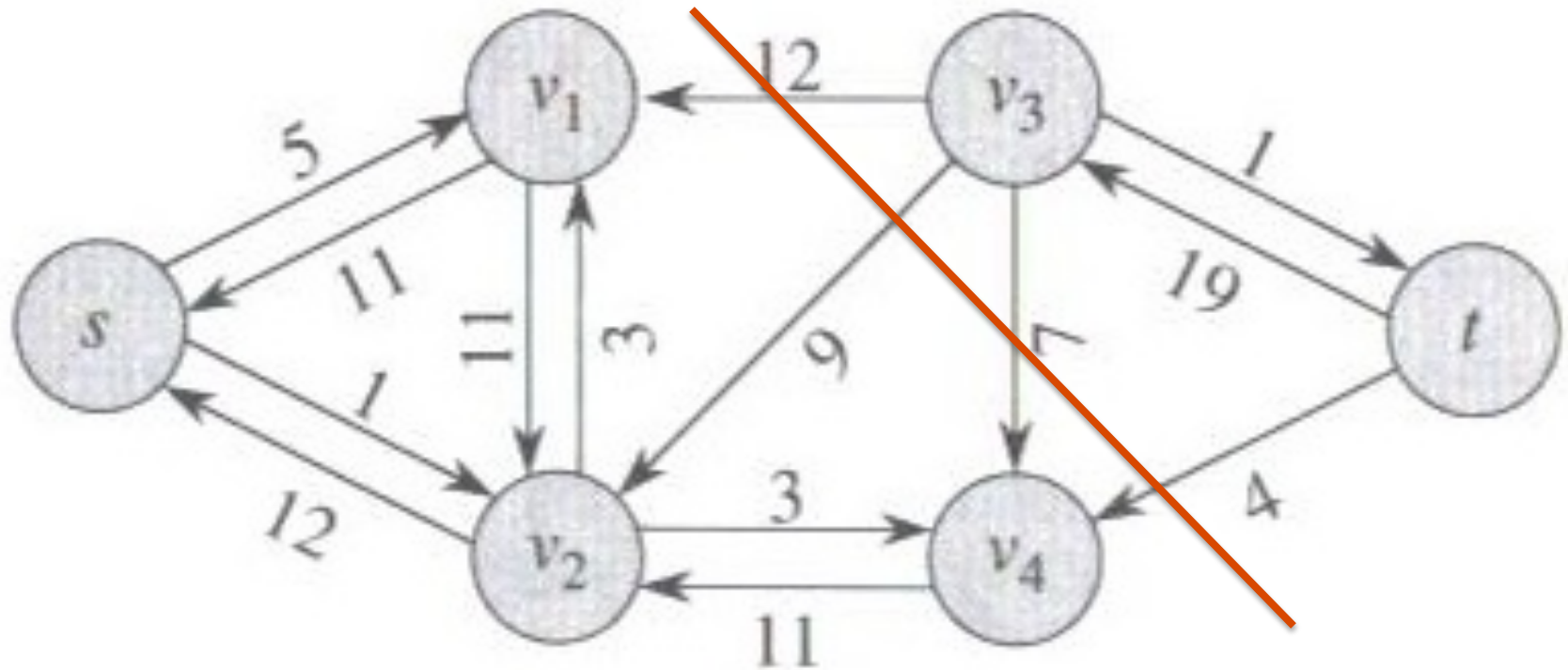


D





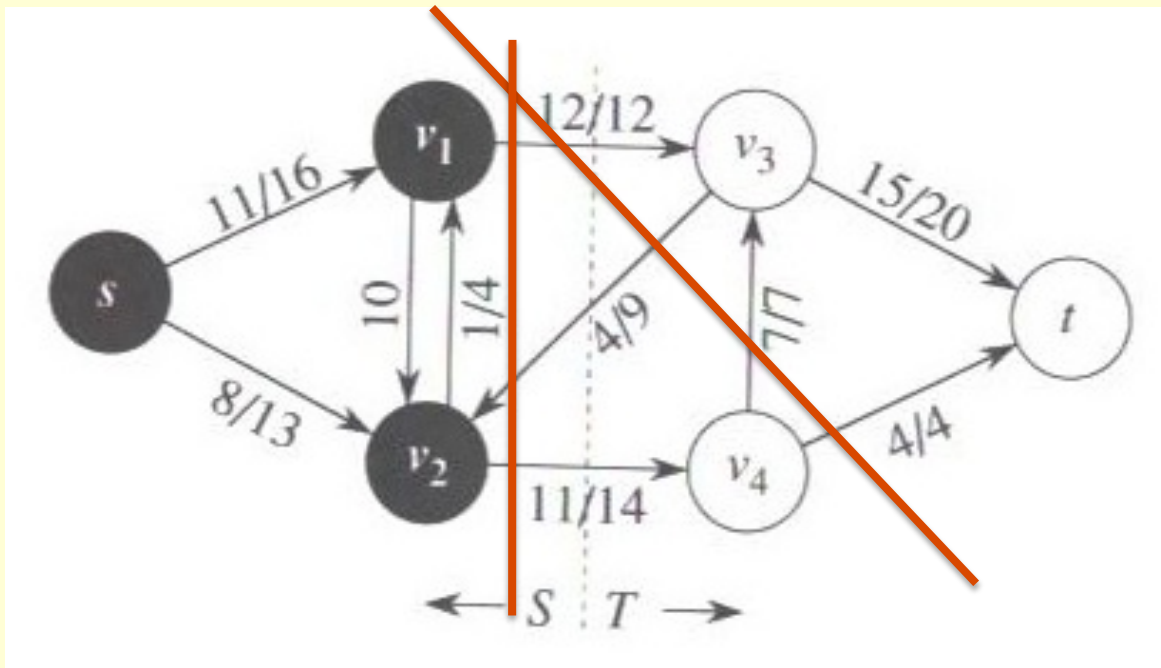
# Ford-Fulkerson Method: Example



- Max-Flow has been reached. Why?
- Cut with zero capacity has been found. Which Cut?
  - $(\{s, v_1, v_2, v_4\}, \{v_3, t\})$

# Correctness of Ford-Fulkerson Method

- Augmentation is possible if
  - Every cut-set is NOT saturated



Cut  $(S, T)$ :

- Capacity = 26
- Flow across cut = 19

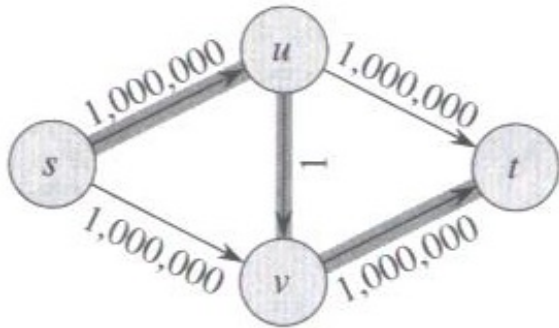
Cut  $(S', T')$ :

- Capacity = 23
- Flow across cut = 19

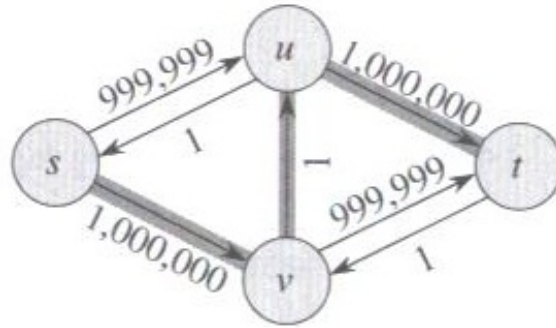
- Theorem: Min-Cut = Max-Flow

# Time Complexity

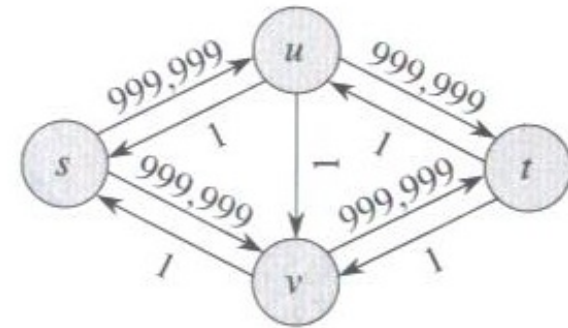
- It can be arbitrarily large.



(a)



(b)

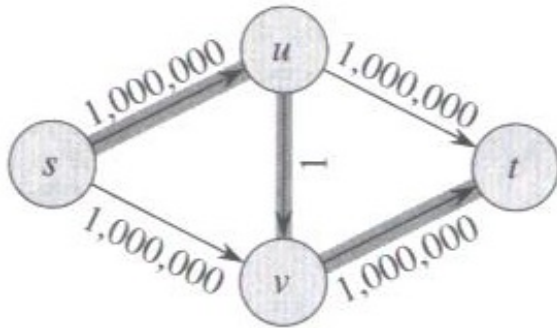


(c)

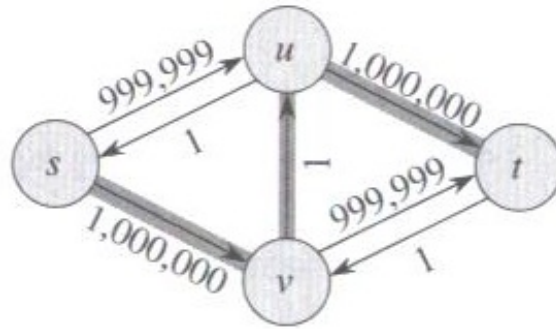
- **Solution:** When finding augmenting path, find the shortest path
- In that case, # of augmentations =  $O(mn)$

# Time Complexity Analysis

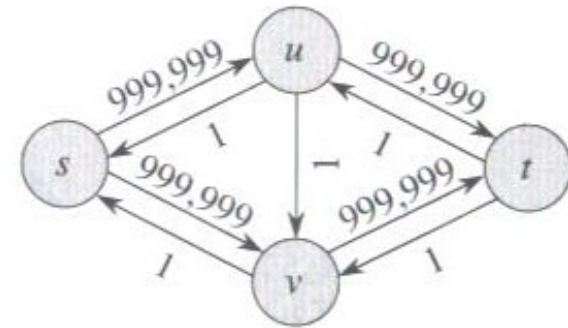
- It can be arbitrarily large.



(a)



(b)



(c)

- **Solution:** When finding augmenting path, find the shortest path
- In that case, # of augmentations =  $O(mn)$

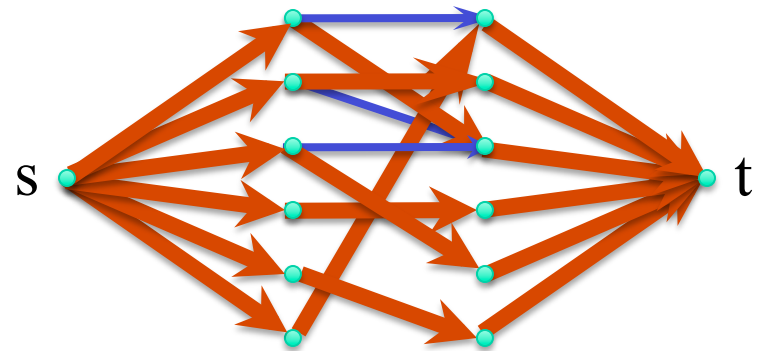
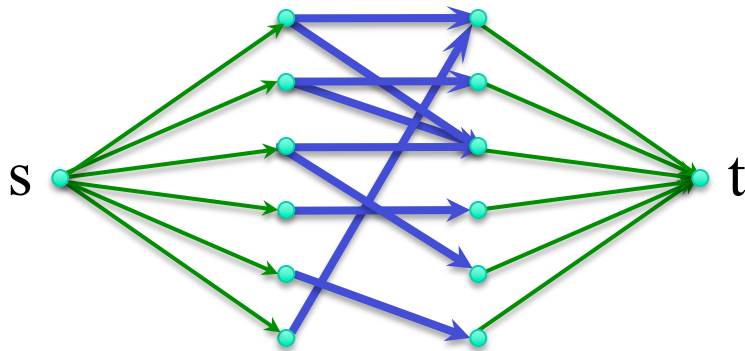
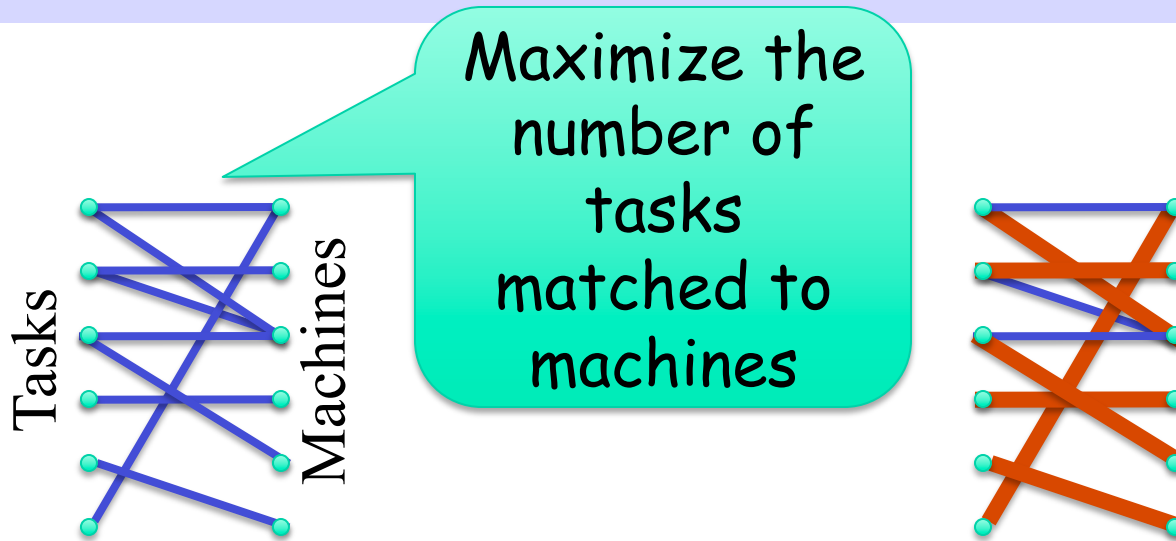
# More efficient Network Flow algorithms

- Push-relabel algorithms [Goldberg, '87]
  - Local algorithm, works on one vertex at a time
  - Avoids maintaining flow conservation rule
    - Excess flow in each node
    - Height function
  - $O(mn^2)$  time complexity
  - Can be improved to  $O(n^3)$

# Generalizations

- Multiple **sources** and **sinks**.
  - Can be reduced to single source and sink

# Bipartite Matching



# Network Flow

- **Input:** Directed graph  $G(V,E)$  with capacity function on edges given by non-negative function  $c: E(G) \rightarrow \mathcal{R}^+$ .
  - Capacity of each edge,  $e$ , is given by  $c(e)$
  - Source vertex  $s$
  - Sink vertex  $t$
- **Question:** Find a flow function  $f$  with the maximum flow value



# Min-Cost Network Flow

- **Input:** Directed graph  $G(V,E)$  with capacity function on edges given by non-negative function  $c: E(G) \rightarrow \mathcal{R}^+$ .
  - Capacity of each edge,  $e$ , is given by  $c(e)$
  - Flow cost of each edge,  $e$ , is given by  $a(e)$ 
    - Implies that cost of flow in  $e$  is  $a(e) \cdot f(e)$
    - Total cost of flow =  $\sum a(e) \cdot f(e)$
  - Source vertex  $s$
  - Sink vertex  $t$
  - Flow required =  $F$
- **Question:** Find min-cost flow function  $f$  with flow value =  $F$

# Minimum Path Cover in DAGs

- **Path Cover**: set of vertex disjoint paths that cover all vertices
- Minimum Path cover in directed acyclic graphs can be reduced to Network Flow