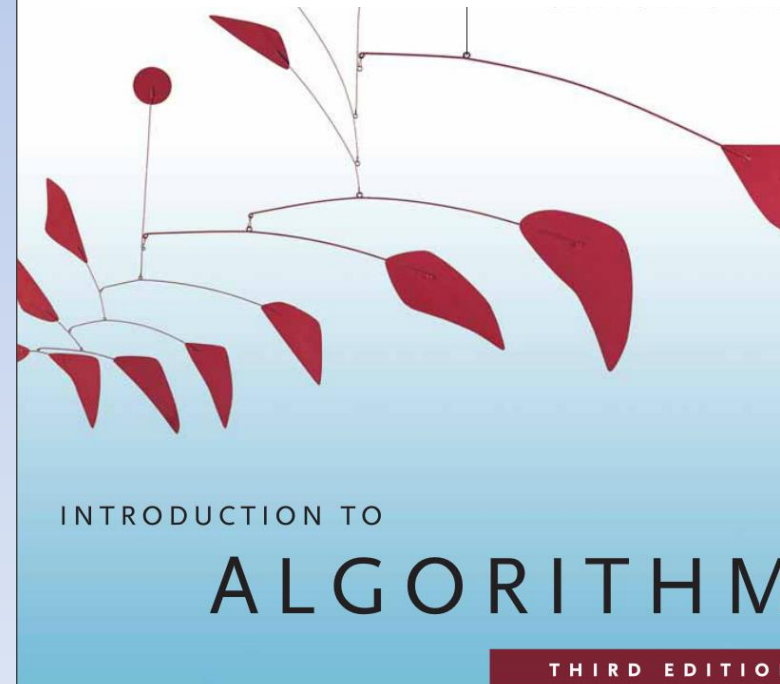


Design and Analysis of Algorithms

Section VI : Graph Algorithms Chapter 26: Maximum Flow

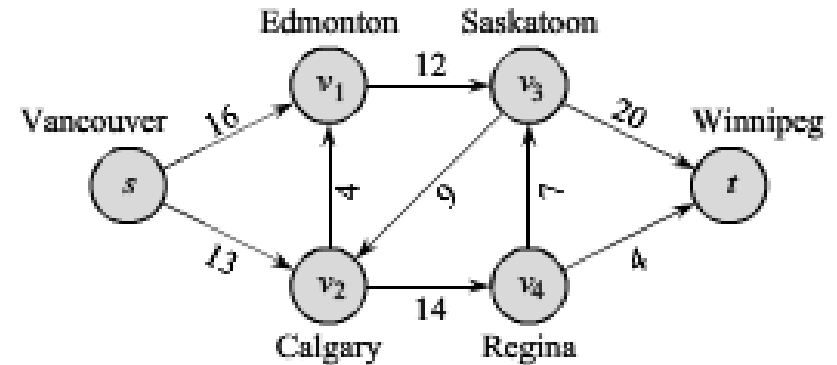
VI Graph Algorithms

26 Maximum Flow

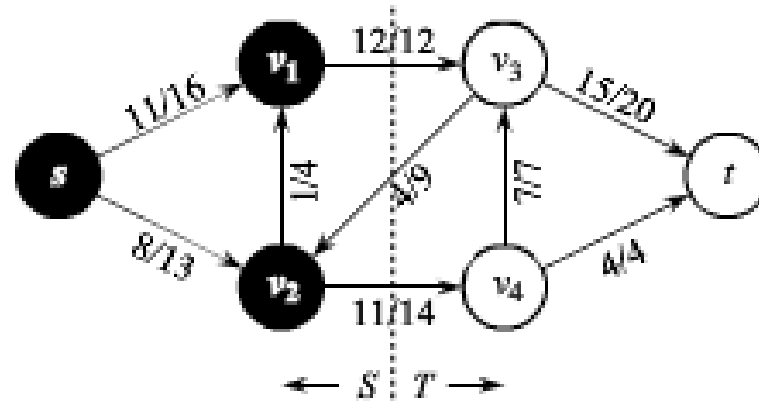


710

Chapter 26 Maximum Flow

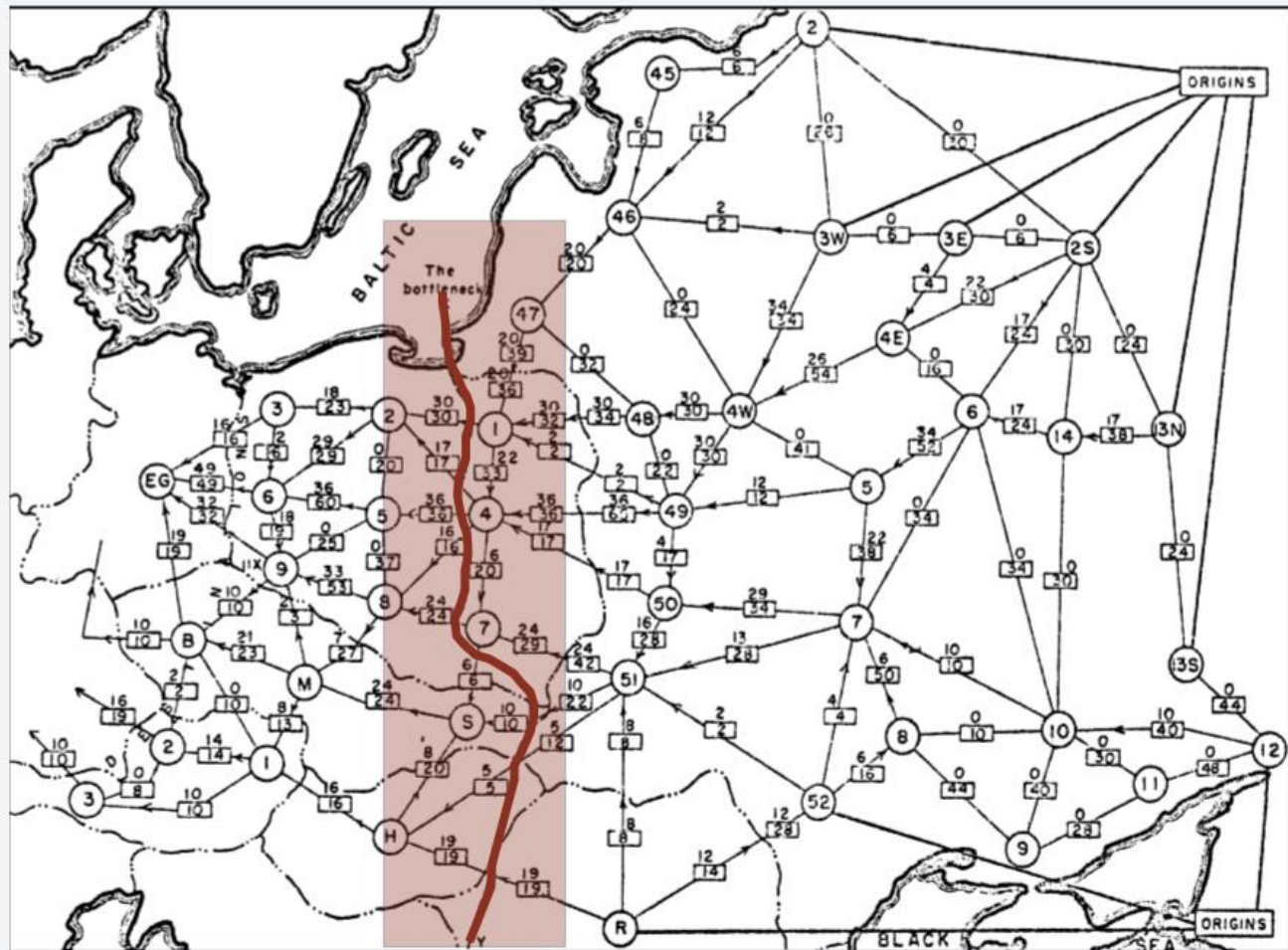


26.2 The Ford-Fulkerson method



Soviet rail network (1950s)

"Free world" goal. Cut supplies (if cold war turns into real war).

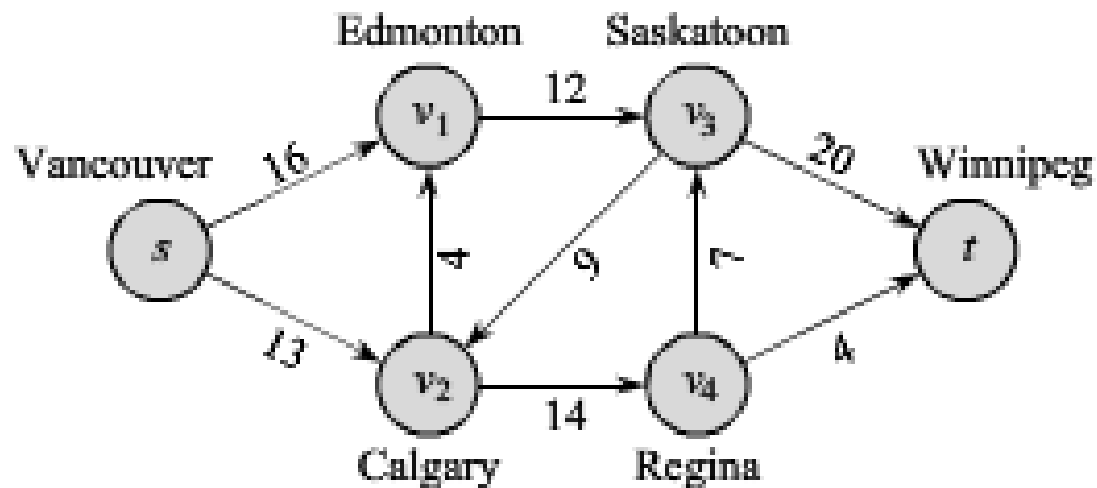


Reference: *On the history of the transportation and maximum flow problems.*
Alexander Schrijver in Math Programming, 91: 3, 2002.

Shipping Example

710

Chapter 26 Maximum Flow



- Lucky Puck Company's Trucking Problem
- Vancouver Factory
- Winnipeg Warehouse

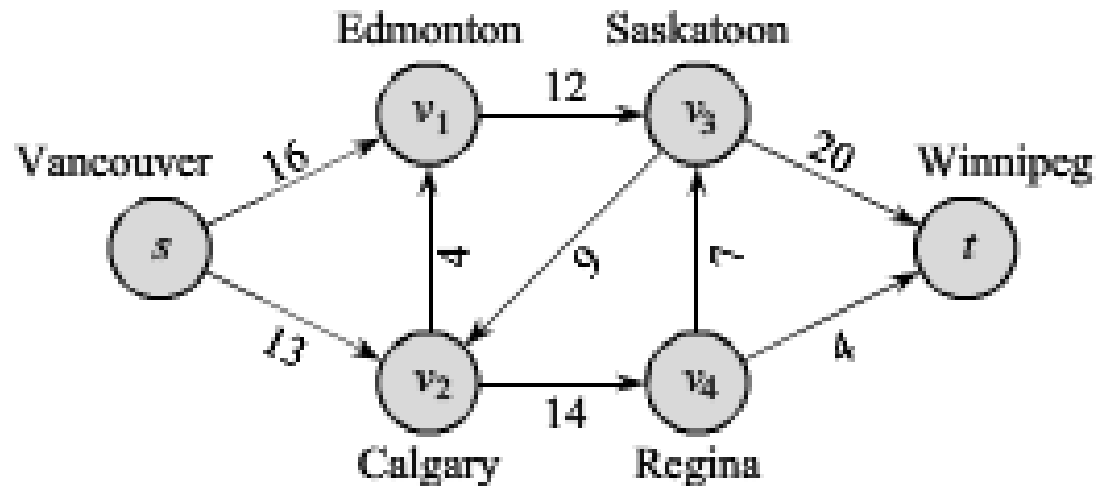
Flow Network

- Directed graph $G = (V, E)$ with
 - edge capacities $c(u,v) \geq 0$
 - a designated source node s
 - a designated target/sink node t
 - flows on edges $f(u,v)$

Shipping Example

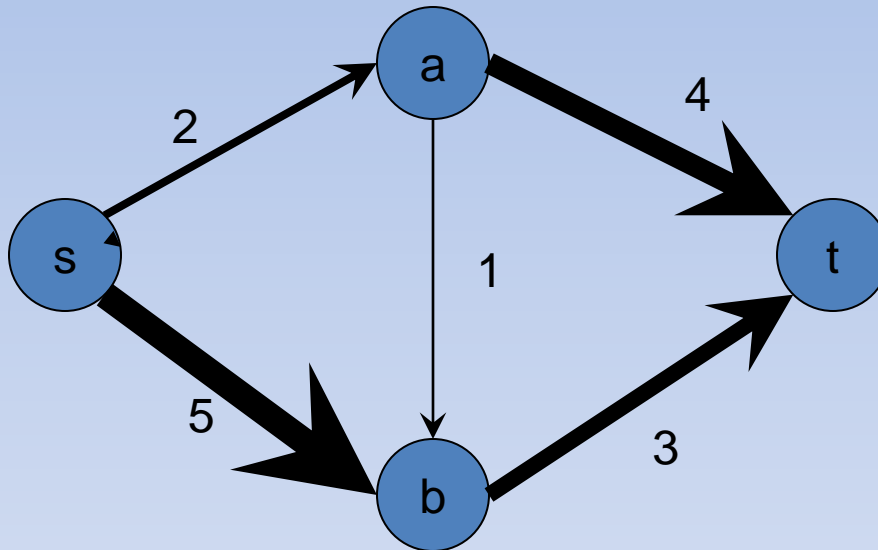
710

Chapter 26 Maximum Flow



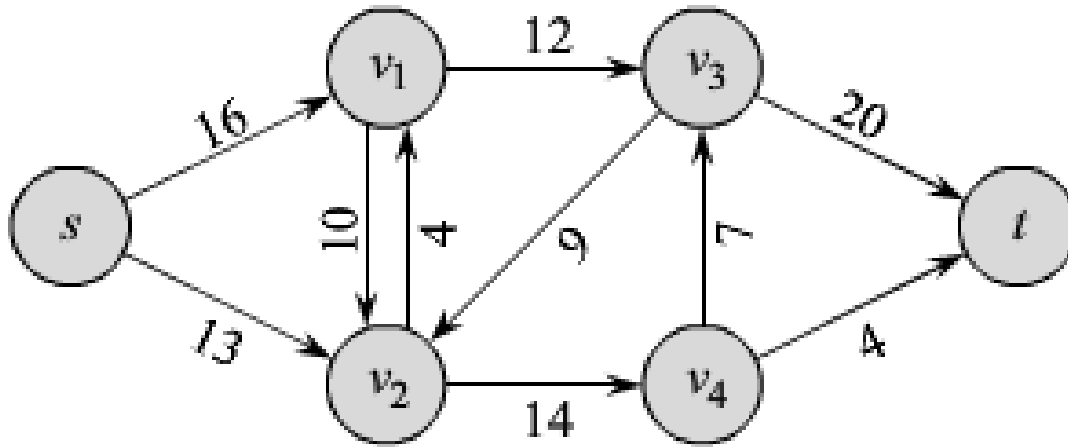
- Lucky Puck Company's Trucking Problem
- Vancouver Factory
- Winnipeg Warehouse

Flow Network

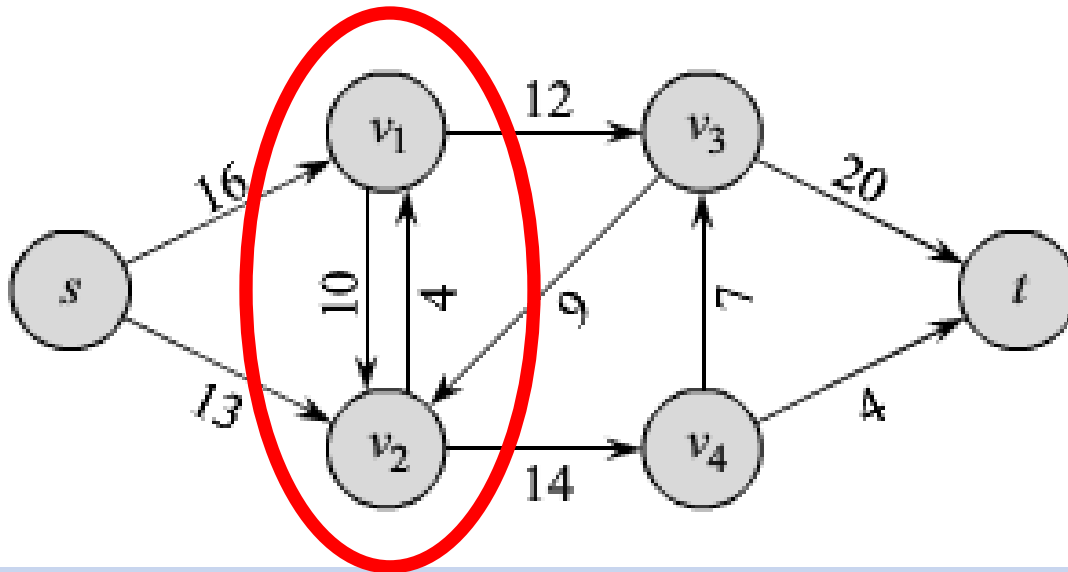


$$\begin{aligned}c(s,a) &= 2 \\c(s,b) &= 5 \\c(a,b) &= 1 \\c(a,t) &= 4 \\c(b,t) &= 3\end{aligned}$$

Antiparallel Edges Not Allowed

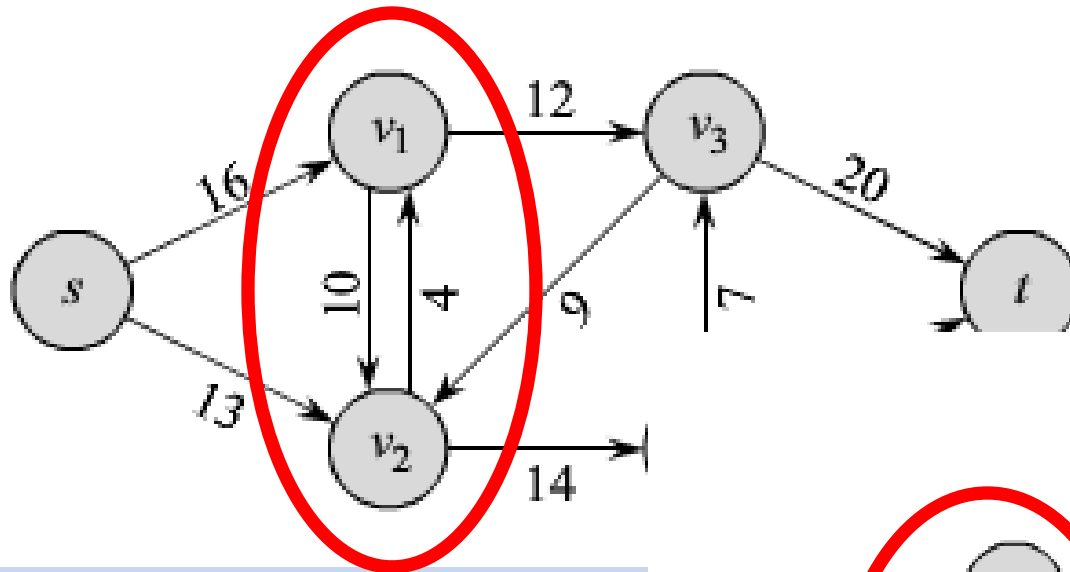


Antiparallel Edges Not Allowed

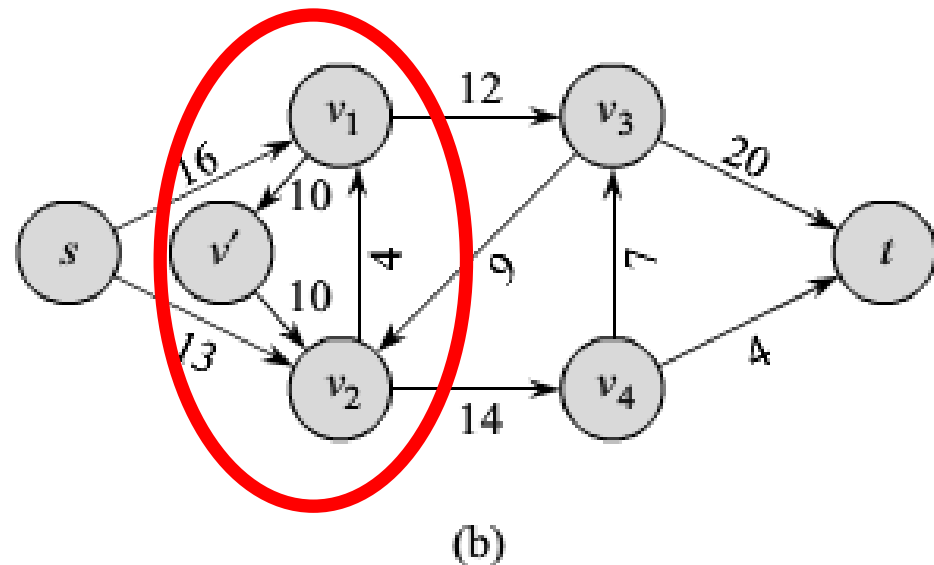


Antiparallel Edges

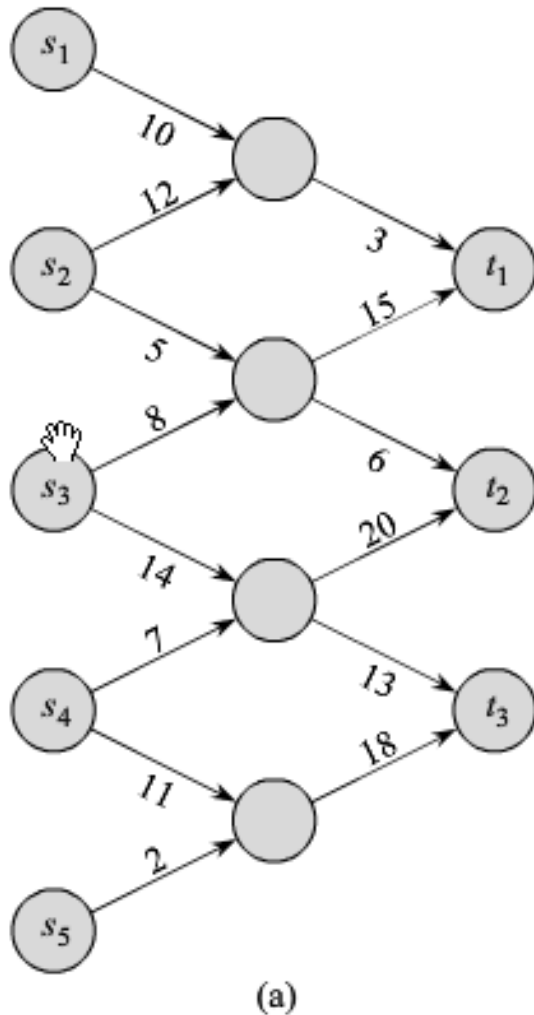
Not Allowed/Easily Converted



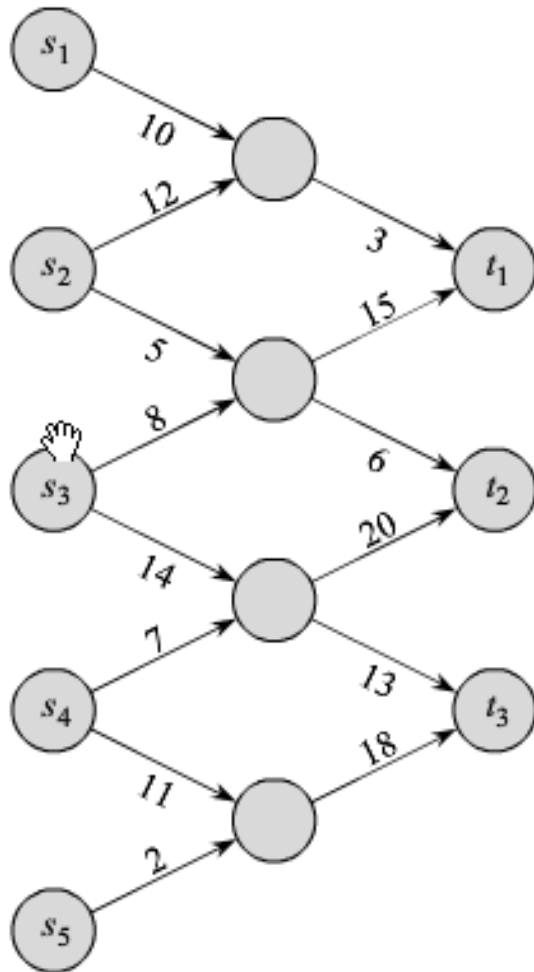
711



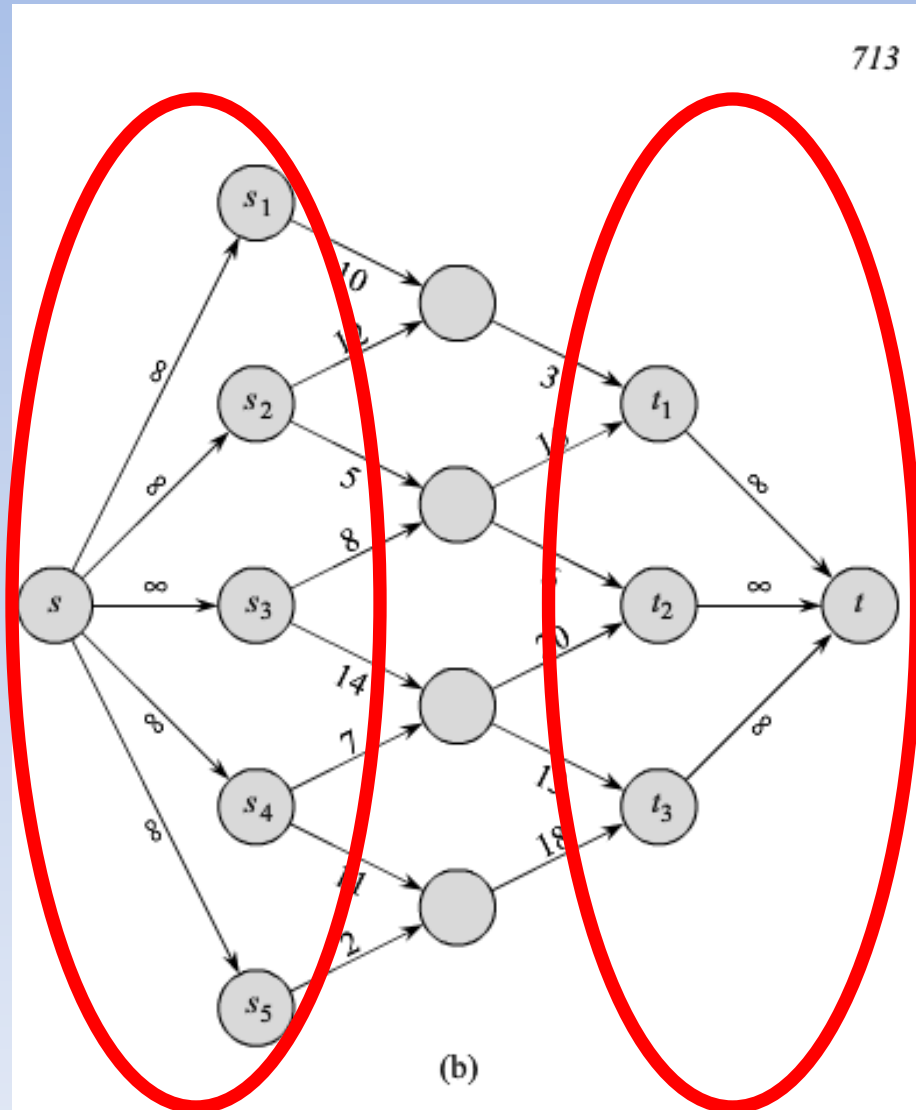
Multiple-Source/ Multiple-Sink



Multiple-Source/Multiple-Sink Easily Converted



(a)



(b)

713

Flow Network

- Directed graph $G = (V, E)$ with
 - edge capacities $c(u,v) \geq 0$
 - flows on edges $f(u,v)$
- Capacity Constraint:
 - For all $u, v \in V$, $0 \leq f(u,v) \leq c(u,v)$
 - Flow is greater than 0
 - Flow is less than capacity

Flow Network

- Directed graph $G = (V, E)$ with
 - edge capacities $c(u,v) \geq 0$
 - flows on edges $f(u,v)$
- Capacity Constraint:
 - For all $u, v \in V$, $0 \leq f(u,v) \leq c(u,v)$
 - Flow is greater than 0
 - Flow is less than capacity

- Flow Conservation:

$$\forall_{u \in V - \{s, t\}} \sum_{v \in V} f(v, u) = \sum_{v \in V} f(u, v)$$

- Flow into Vertex equals Flow out

Applications

- fluid in pipes
- current in an electrical circuit
- traffic on roads
- data flow in a computer network
- money flow in an economy
- etc.

Maximum Flow Problem

- Assuming
 - Source produces the material at a steady rate
 - Sink consumes the material at a steady rate
- What is the maximum net flow from s to t ?

Residual Capacity

- Given a flow f in network $G = (V, E)$
- Consider a pair of vertices $u, v \in V$
- **Residual capacity** =
amount of additional flow we can push from u to v
 - $c_f(u, v) = c(u, v) - f(u, v) \geq 0 \quad | \quad IF (u, v) \in E$
Since $f(u, v) \leq c(u, v)$
 - $c_f(u, v) = f(v, u) \quad | \quad IF (v, u) \in E$
Represents potential reduction in opposite flow.

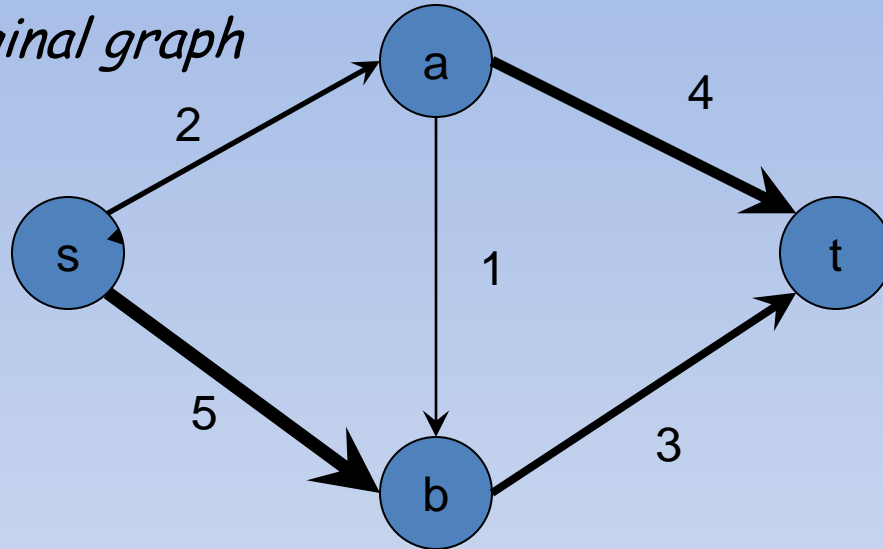
AND no parallel edges

Residual Capacity

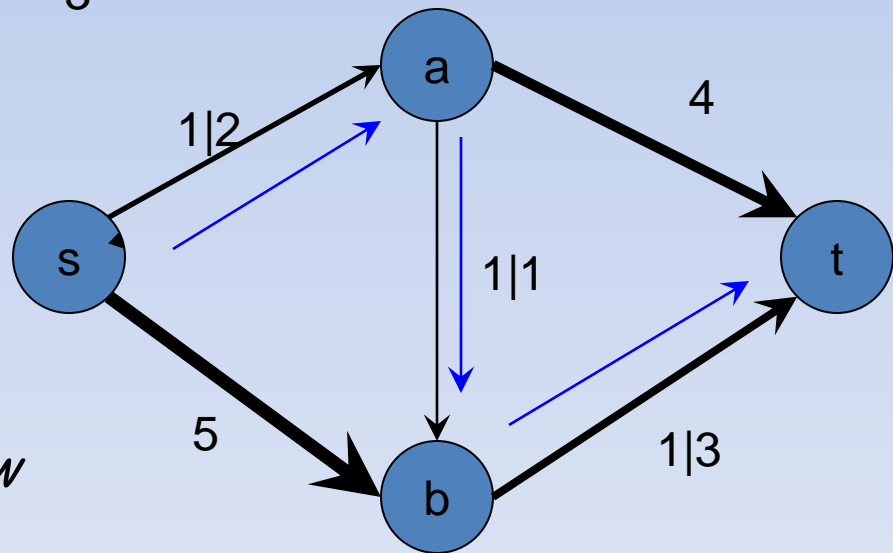
- Residual network induced by flow f is defined as
- $G_f = (V, E_f)$
 $E_f = \{ (u, v) \in V \times V \mid c_f(u, v) > 0 \}$

Example (1)

original graph

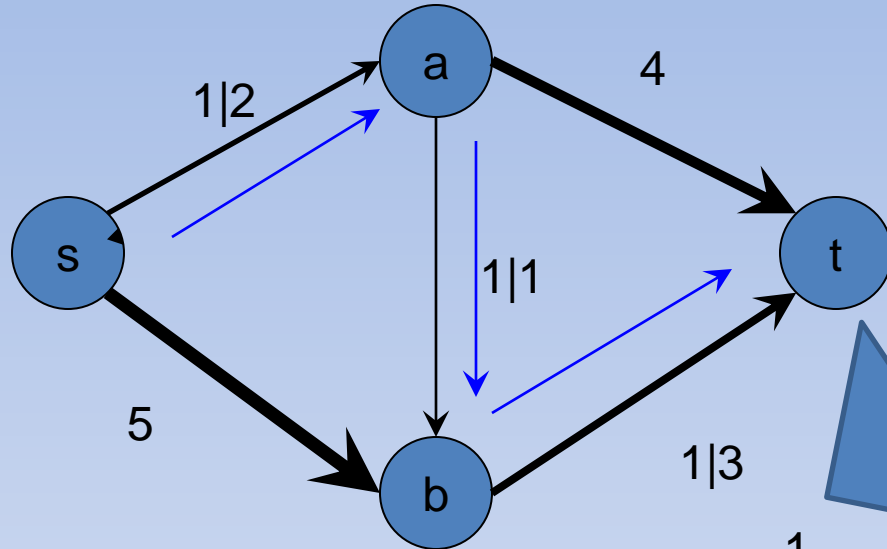


graph with flow

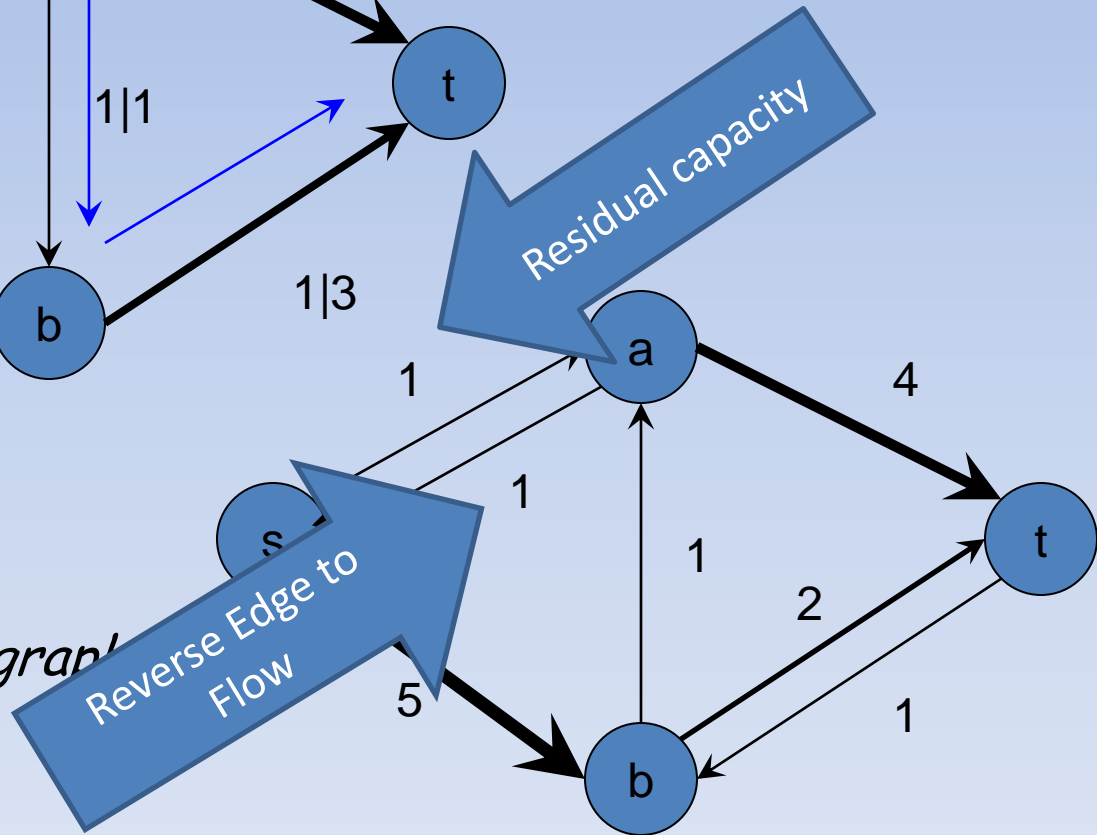


graph with flow

Example (2)



residual graph



Augmentation

- Given:
 - Flow f in G
 - Flow f' in G_f (the Residual Graph from G w/ f)

$$(f \uparrow f')(u, v) = \begin{cases} f(u, v) + f'(u, v) - f'(v, u) & \text{if } (u, v) \in E, \\ 0 & \text{otherwise.} \end{cases} \quad (26.4)$$

Augmented Flow is a Flow

- Given:
 - Flow f in G
 - Flow f' in G_f (the Residual Graph from G w/ f)

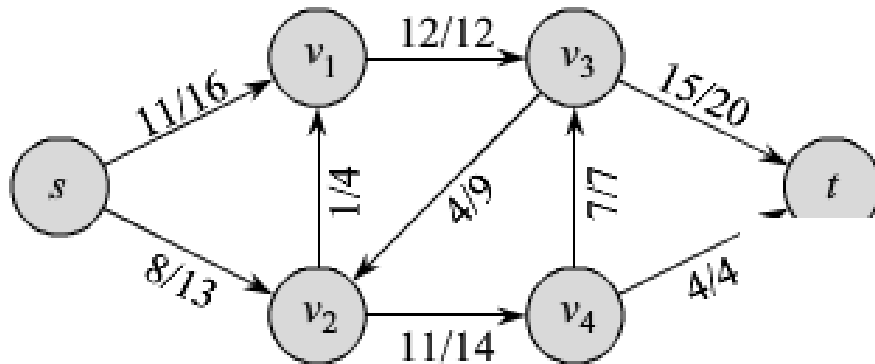
$$(f \uparrow f')(u, v) = \begin{cases} f(u, v) + f'(u, v) - f'(v, u) & \text{if } (u, v) \in E, \\ 0 & \text{otherwise.} \end{cases} \quad (26.4)$$

Lemma 26.1

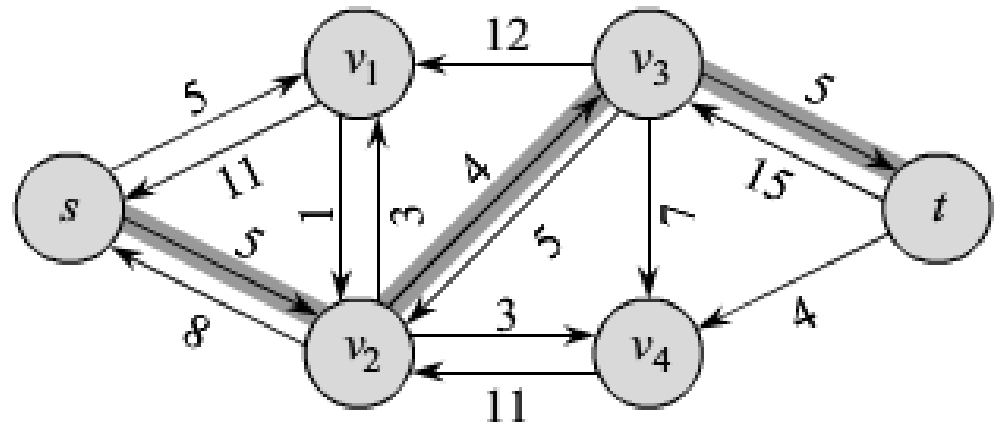
Let $G = (V, E)$ be a flow network with source s and sink t , and let f be a flow in G . Let G_f be the residual network of G induced by f , and let f' be a flow in G_f . Then the function $f \uparrow f'$ defined in equation (26.4) is a flow in G with value $|f \uparrow f'| = |f| + |f'|$.

Augmentation Path

- Augmentation Path is a simple path in the residual graph



717



Augmentation Path

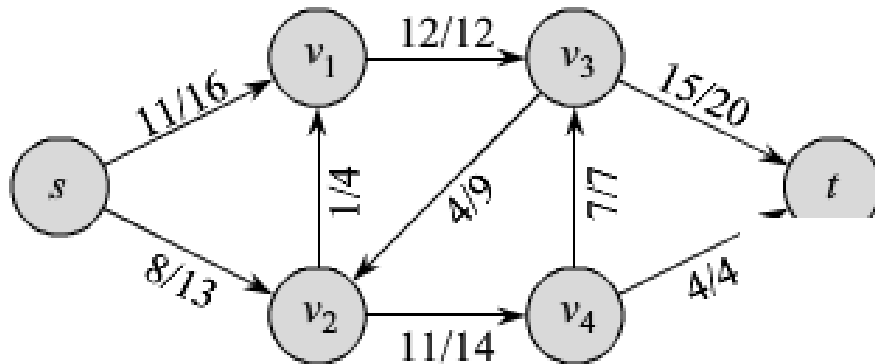
- Augmentation Path is a simple path in the residual graph
- Residual Capacity is the min residual capacity of any link in the Augmentation Path

$$c_f(p) = \min \{c_f(u, v) : (u, v) \text{ is on } p\}$$

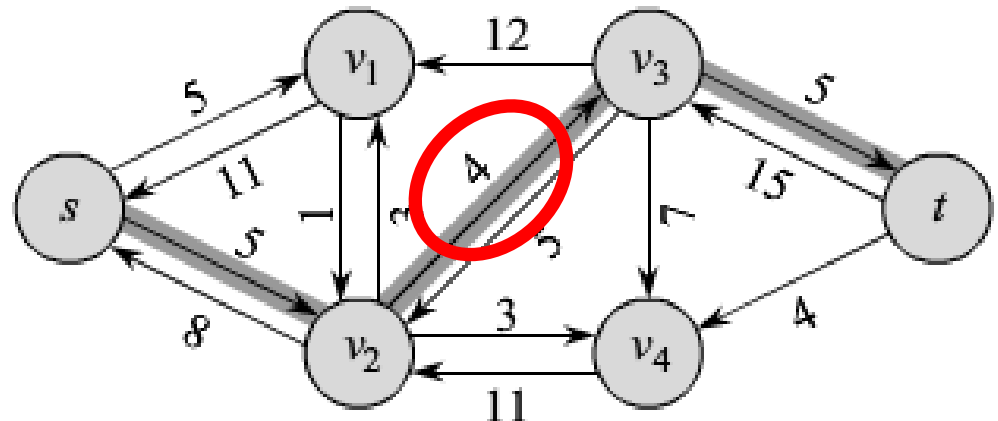
Augmentation Path

- Residual Capacity is the min residual capacity of any link in the Augmentation Path

$$c_f(p) = \min \{c_f(u, v) : (u, v) \text{ is on } p\}$$

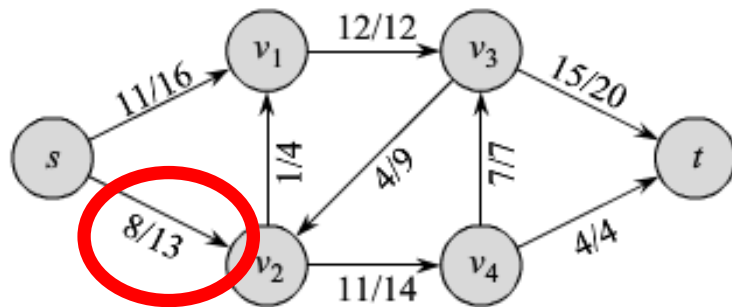


717

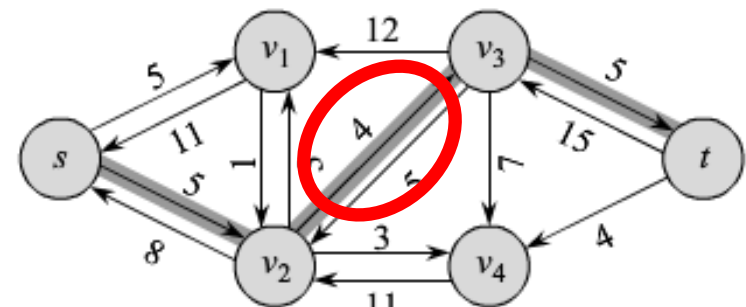


Augmentation

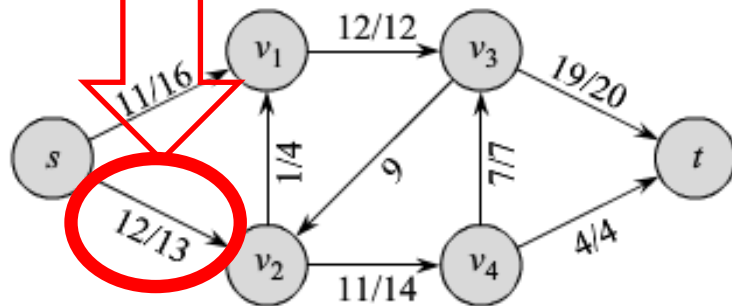
$$(f \uparrow f')(u, v) = \begin{cases} f(u, v) + f'(u, v) - f'(v, u) & \text{if } (u, v) \in E, \\ 0 & \text{otherwise.} \end{cases} \quad (26.4)$$



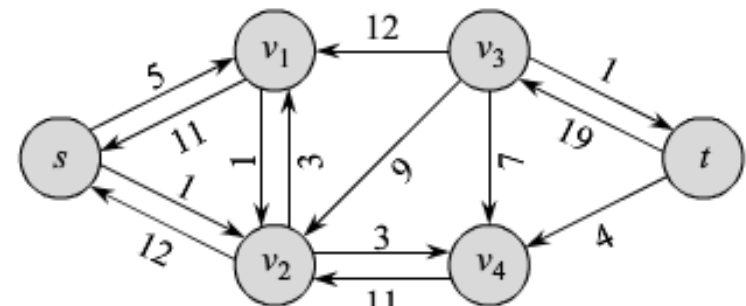
(a)



(b)



(c)



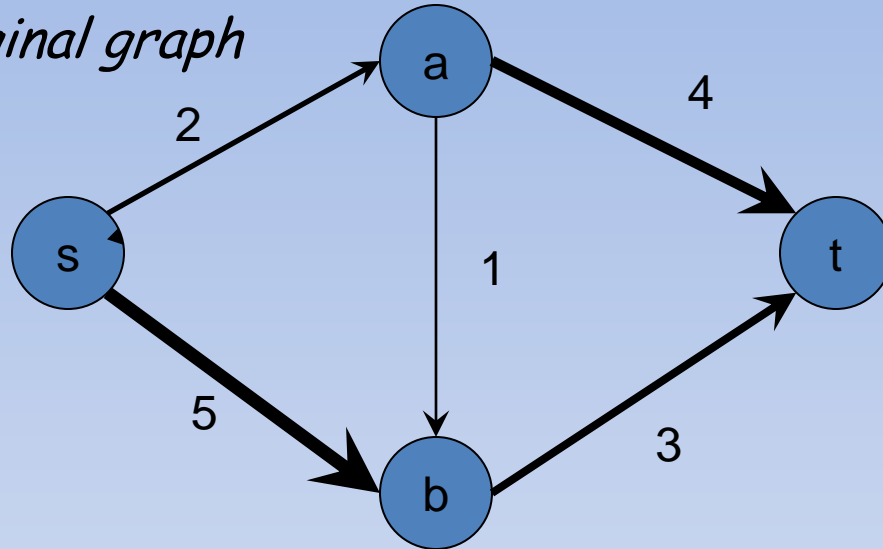
(d)

Ford-Fulkerson Algorithm

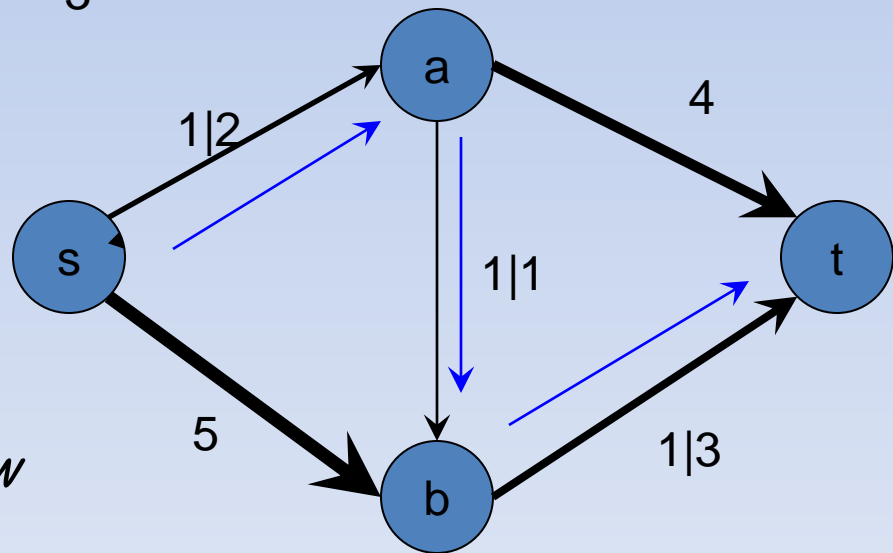
- Start with zero flow
- Repeat until convergence:
 - Find an **augmenting path**, from s to t along which we can push more flow
 - Augment flow along this path

Example (1)

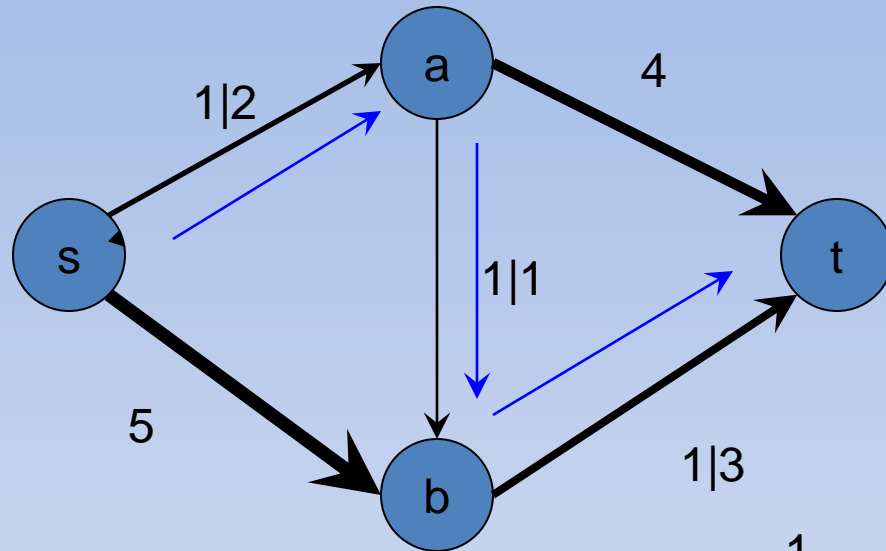
original graph



graph with flow

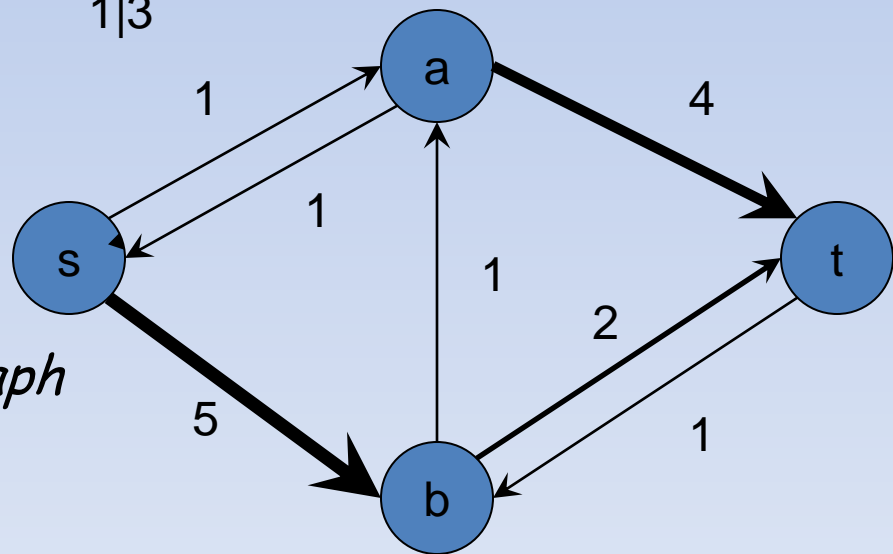


graph with flow



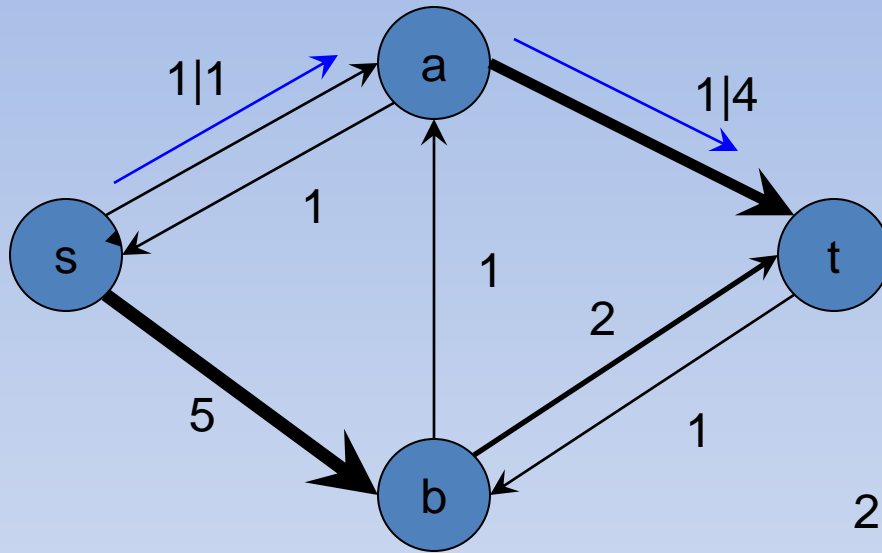
Example (2)

residual graph

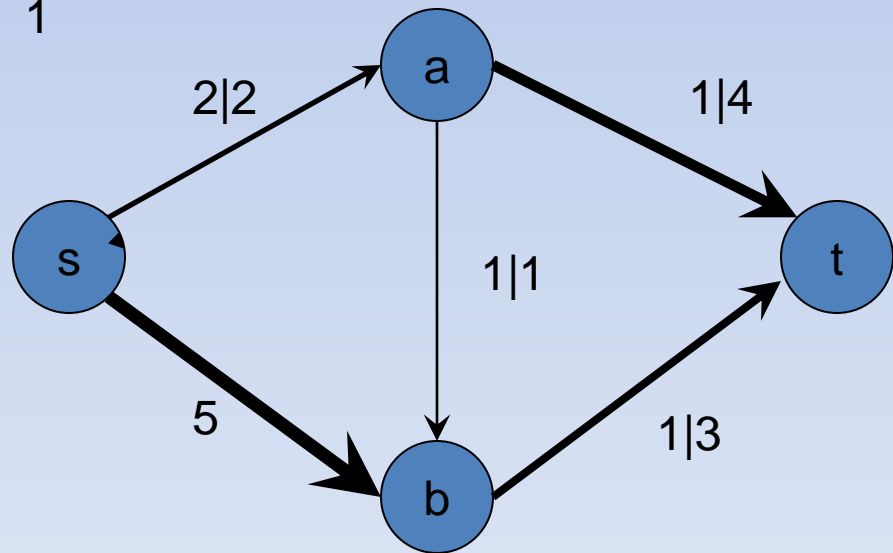


Example (3)

residual graph, with flow-augmenting path

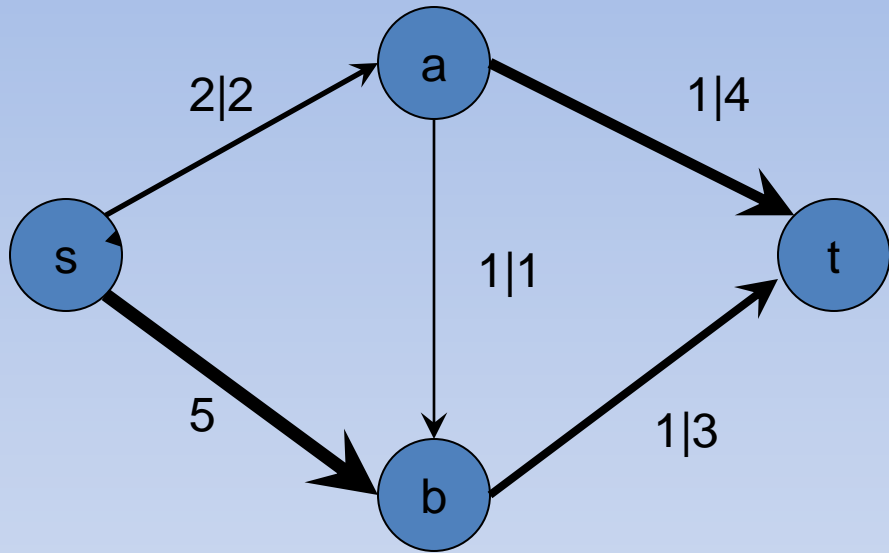


*original graph
with new flow*

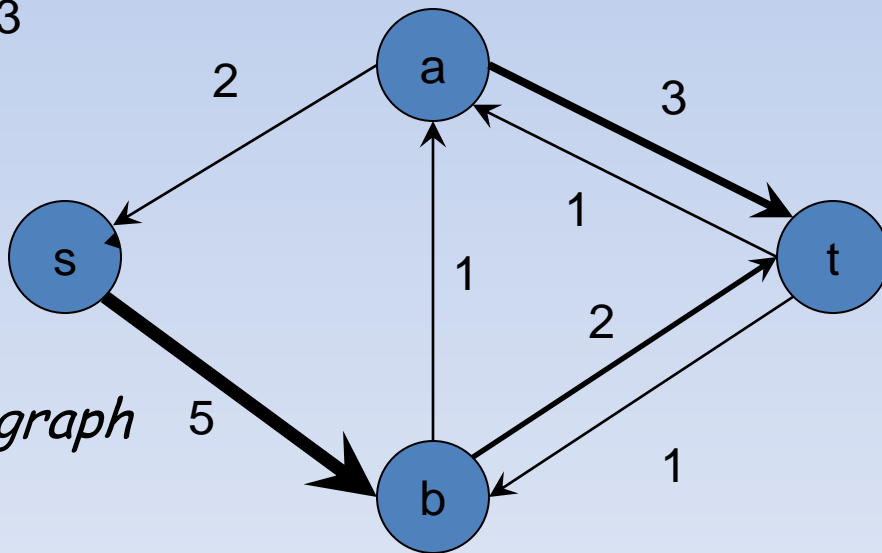


Example (4)

original graph with new flow

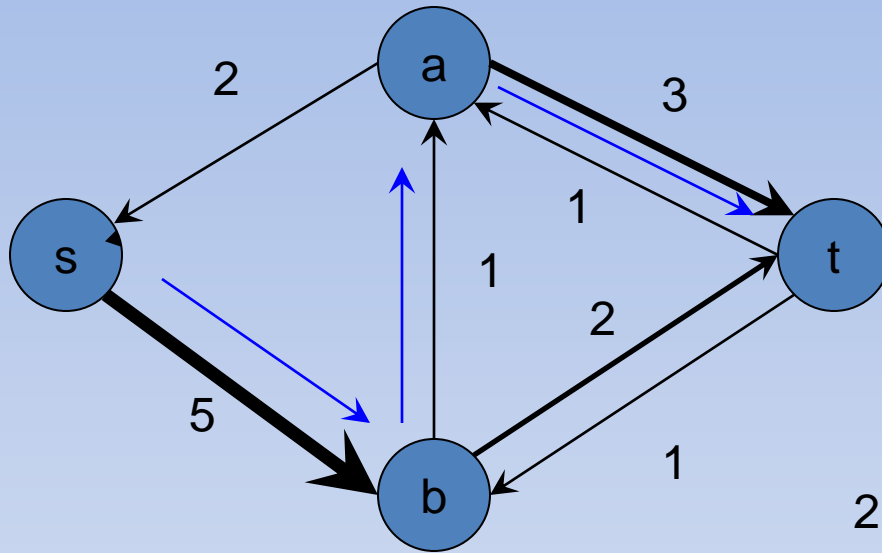


new residual graph

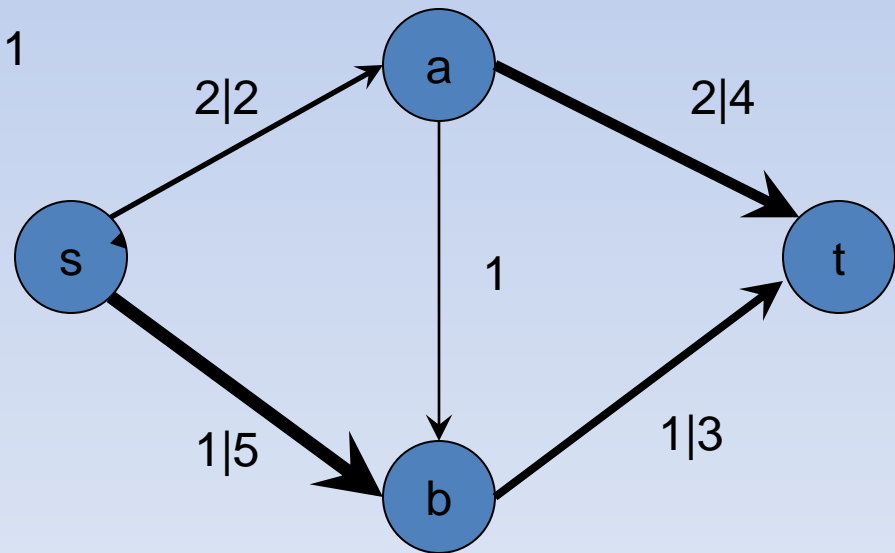


Example (5)

new residual graph, with augmenting path

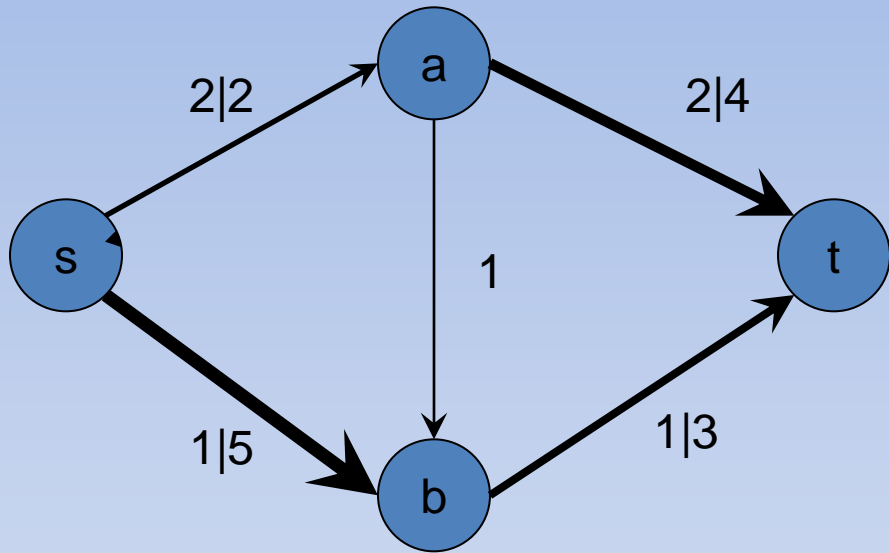


*original graph
with new flow*

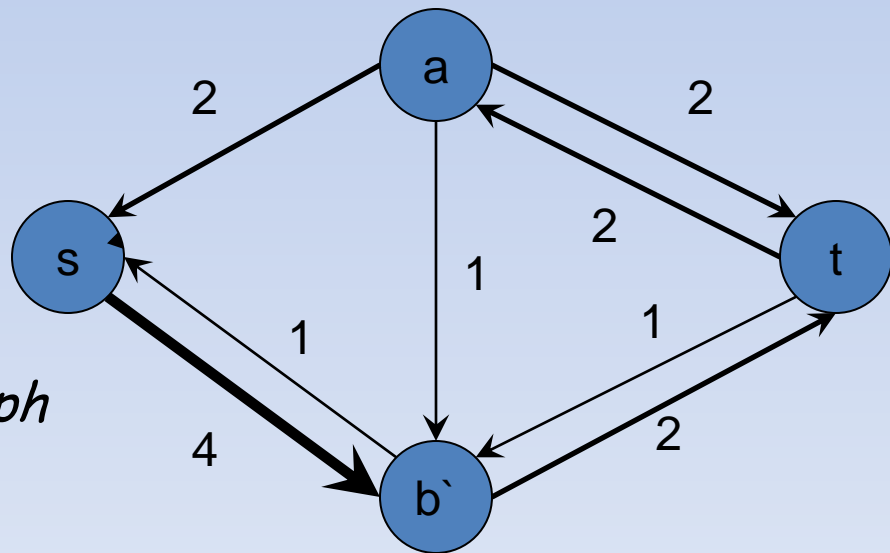


Example (6)

original graph with new flow

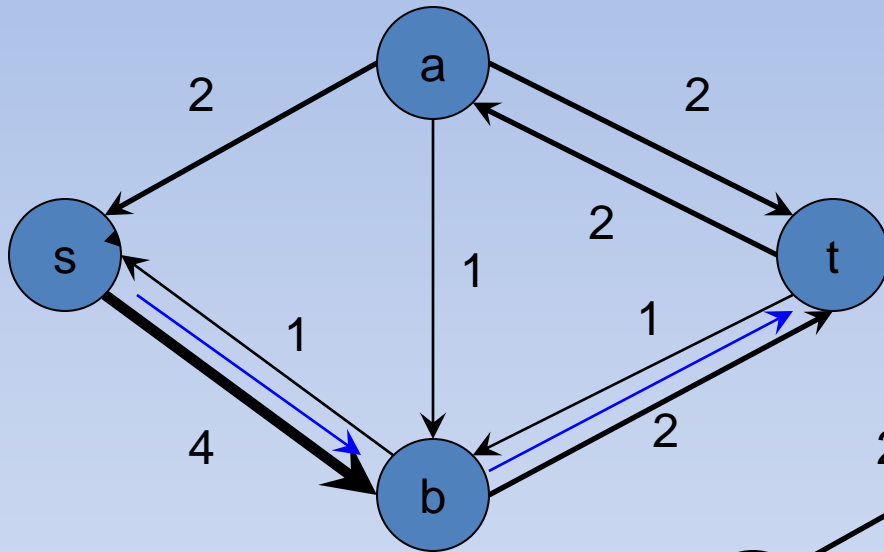


new residual graph

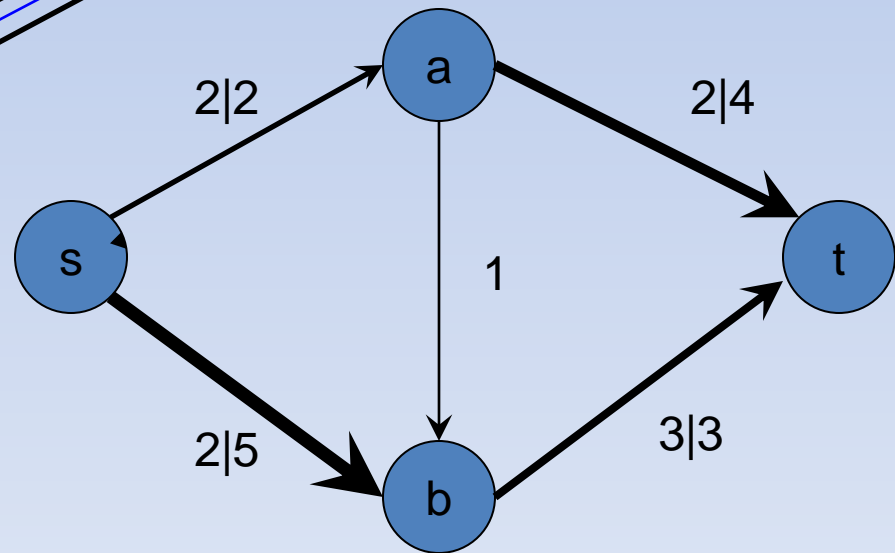


Example (7)

new residual graph, with augmenting path

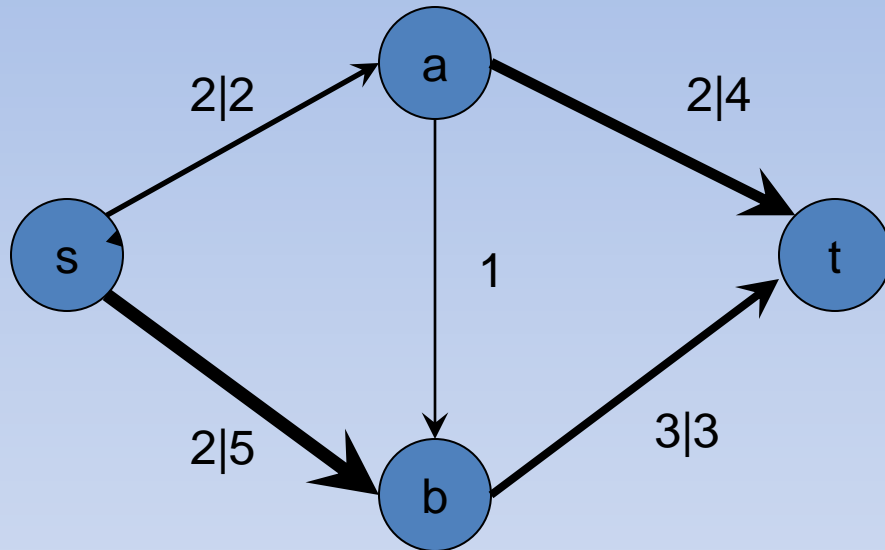


*original graph
with new flow*

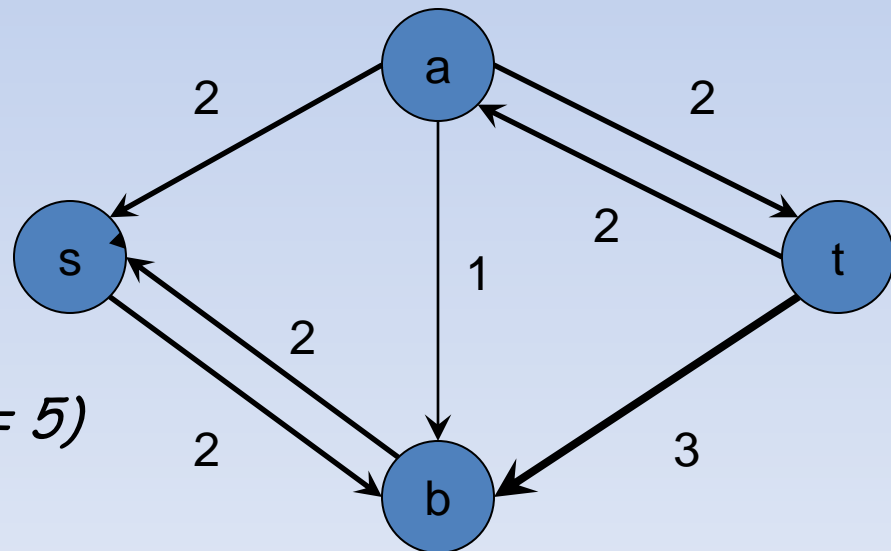


Example (8)

original graph, with new flow



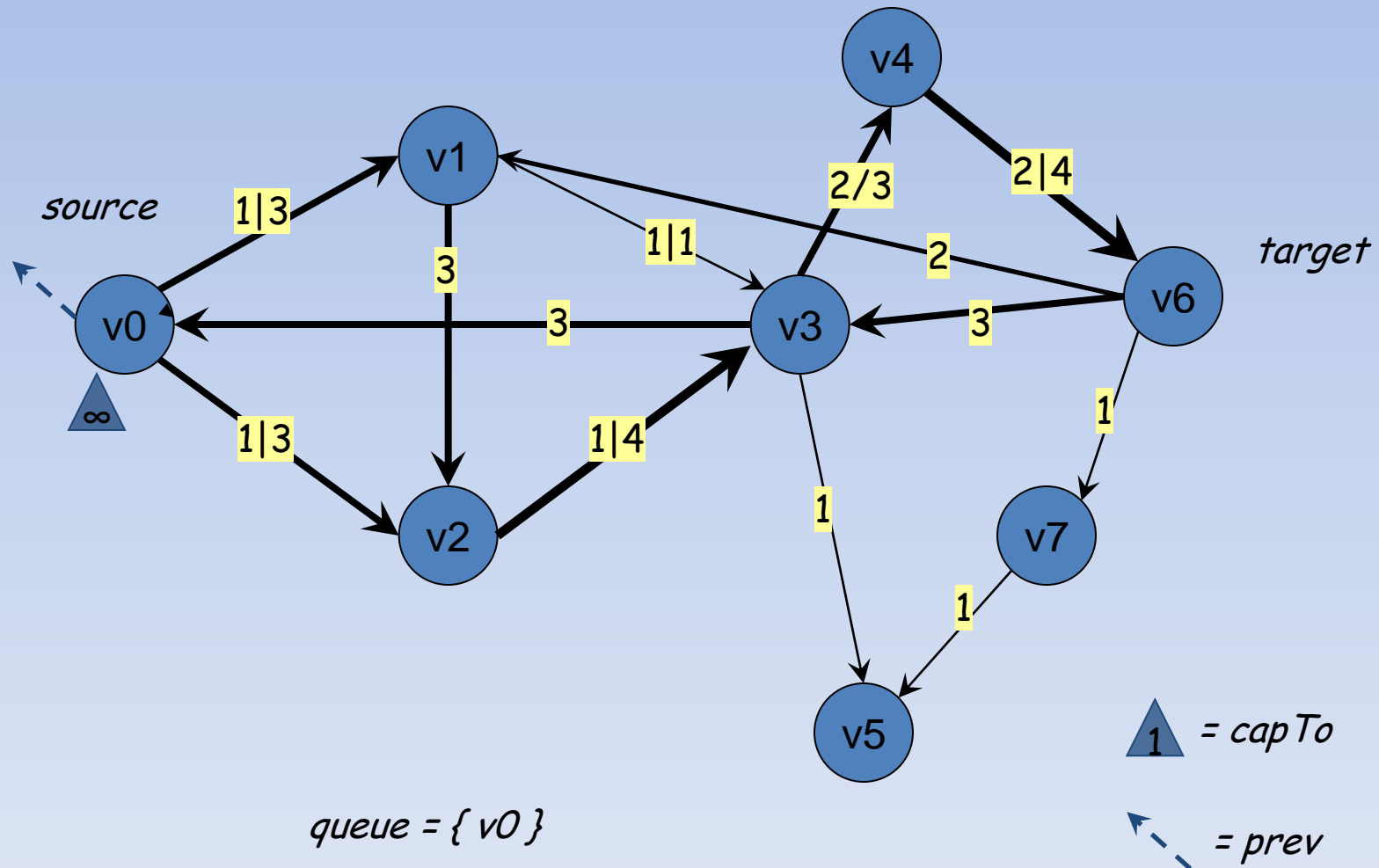
*residual graph
(maximum flow = 5)*



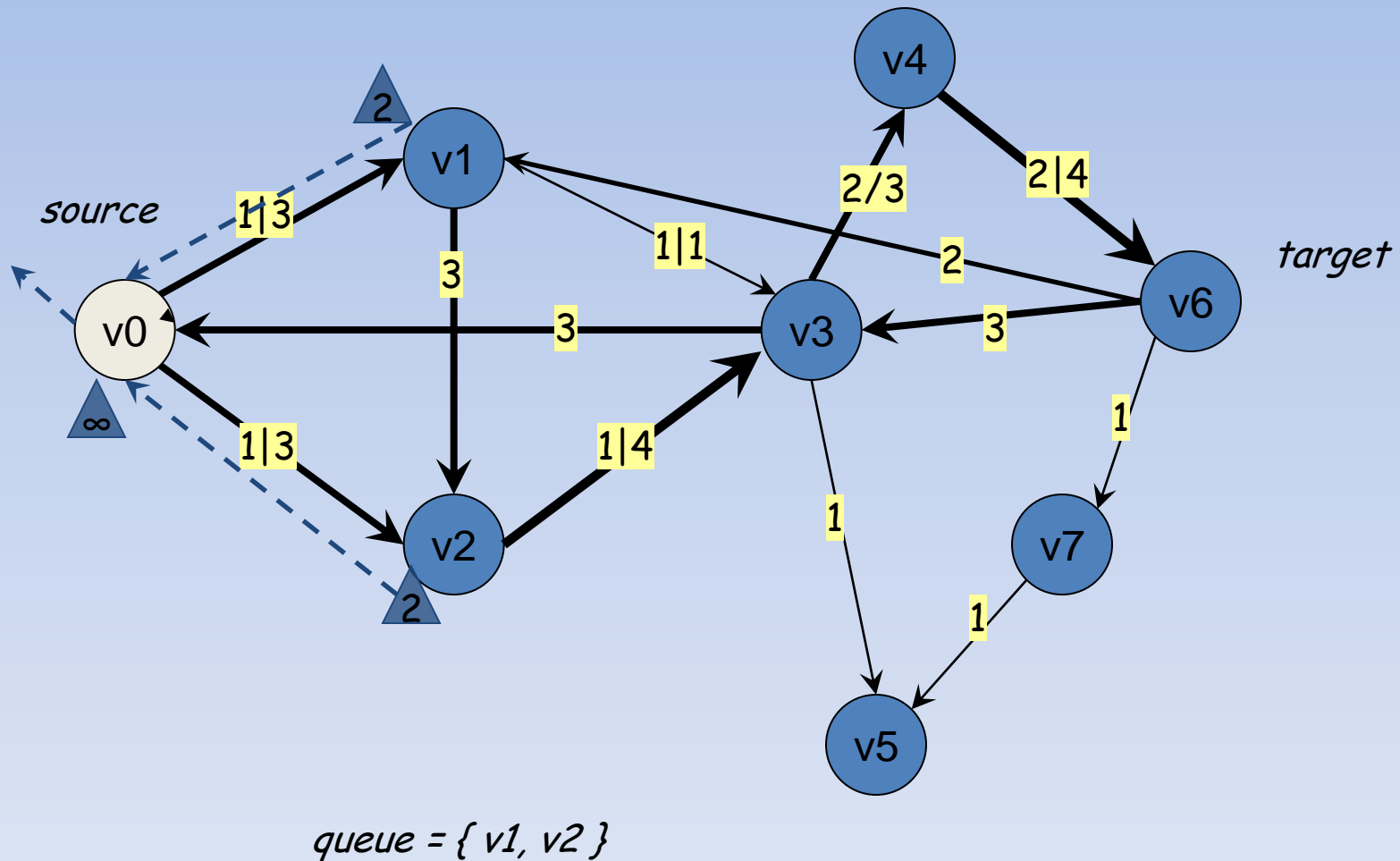
FORD-FULKERSON(G, s, t)

```
1  for each edge  $(u, v) \in G.E$ 
2       $(u, v).f = 0$ 
3  while there exists a path  $p$  from  $s$  to  $t$  in the residual network  $G_f$ 
4       $c_f(p) = \min \{c_f(u, v) : (u, v) \text{ is in } p\}$ 
5      for each edge  $(u, v)$  in  $p$ 
6          if  $(u, v) \in E$ 
7               $(u, v).f = (u, v).f + c_f(p)$ 
8          else  $(v, u).f = (v, u).f - c_f(p)$ 
```

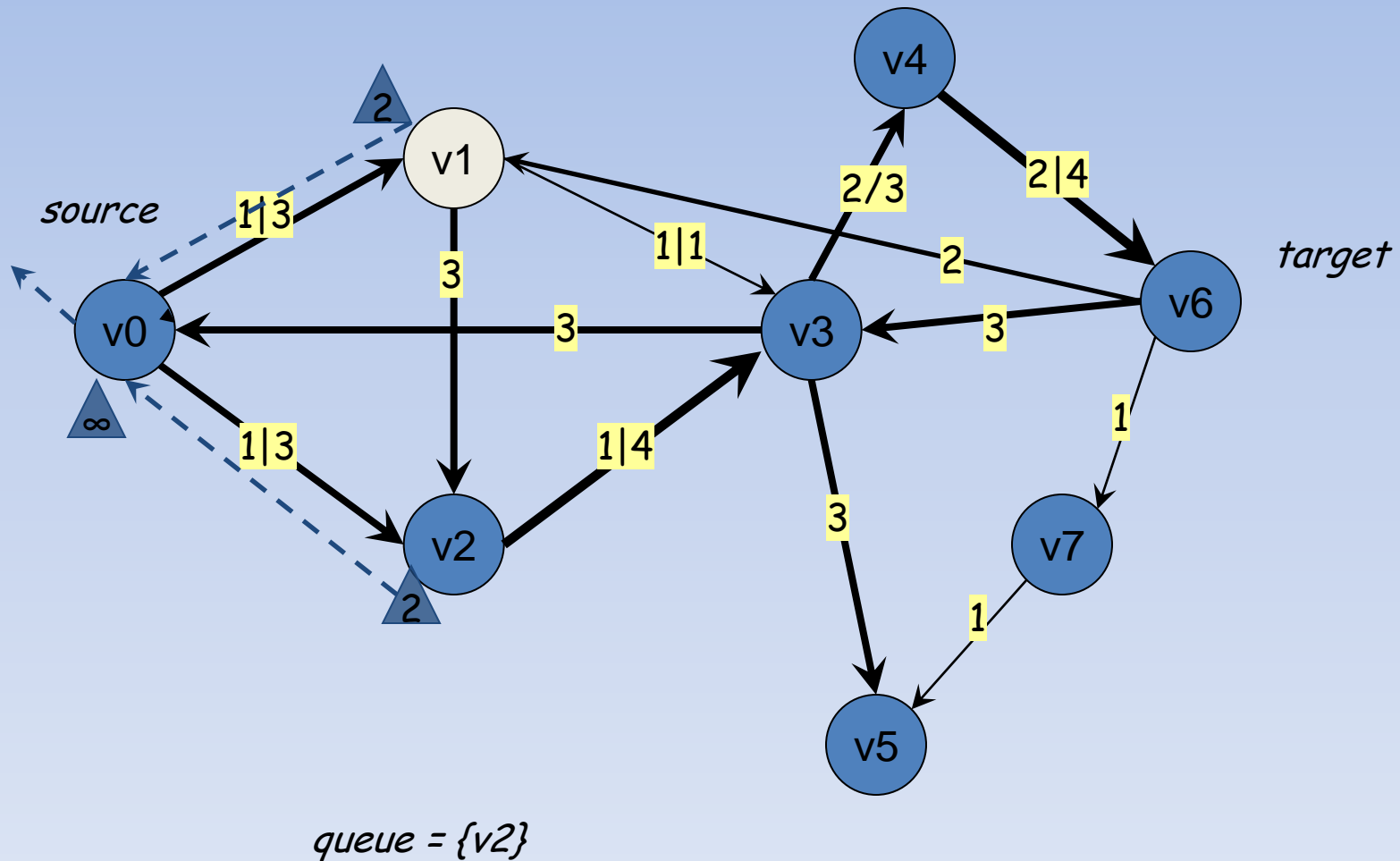
Example: Finding Augmenting Path



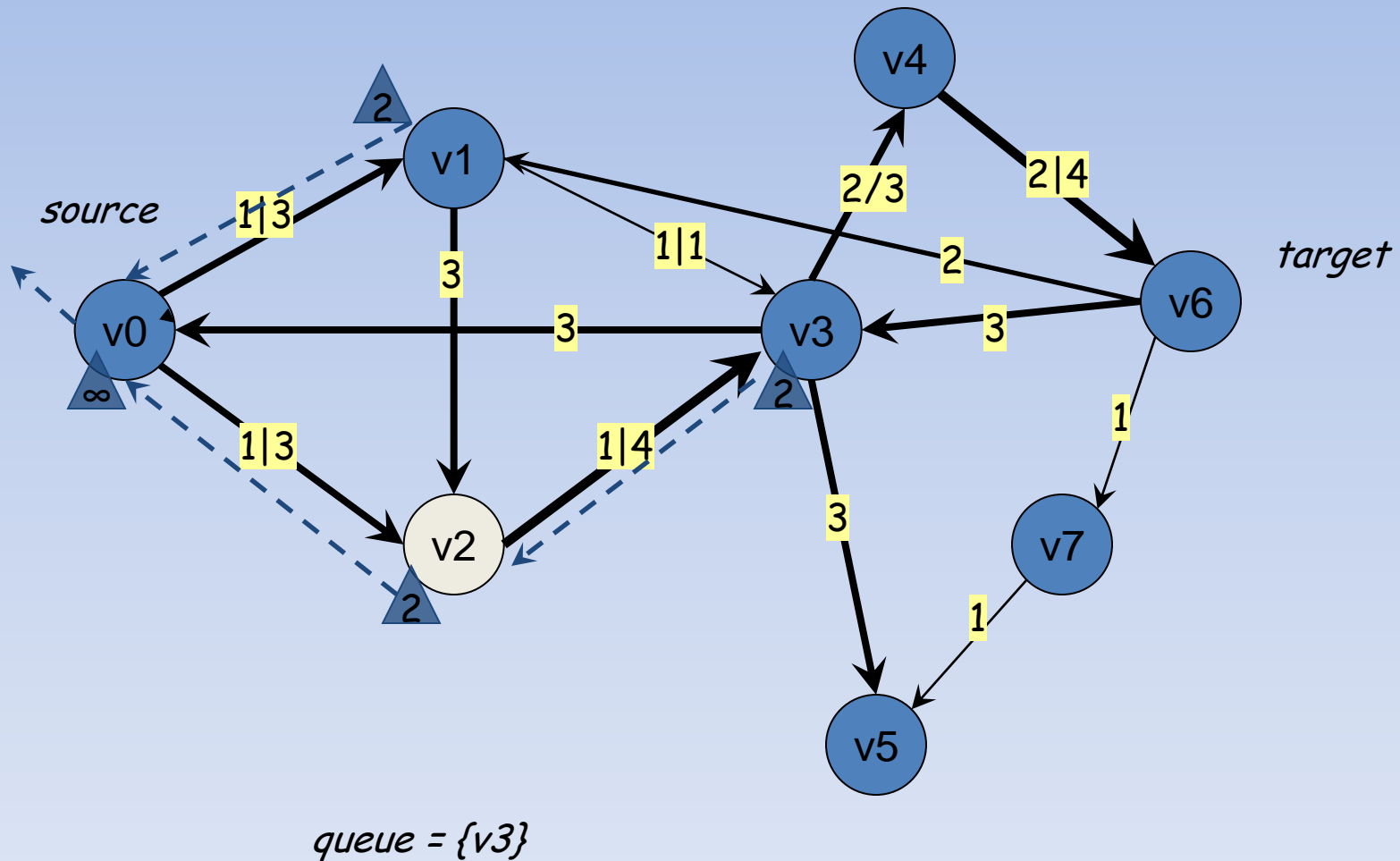
Application to Augmenting Path



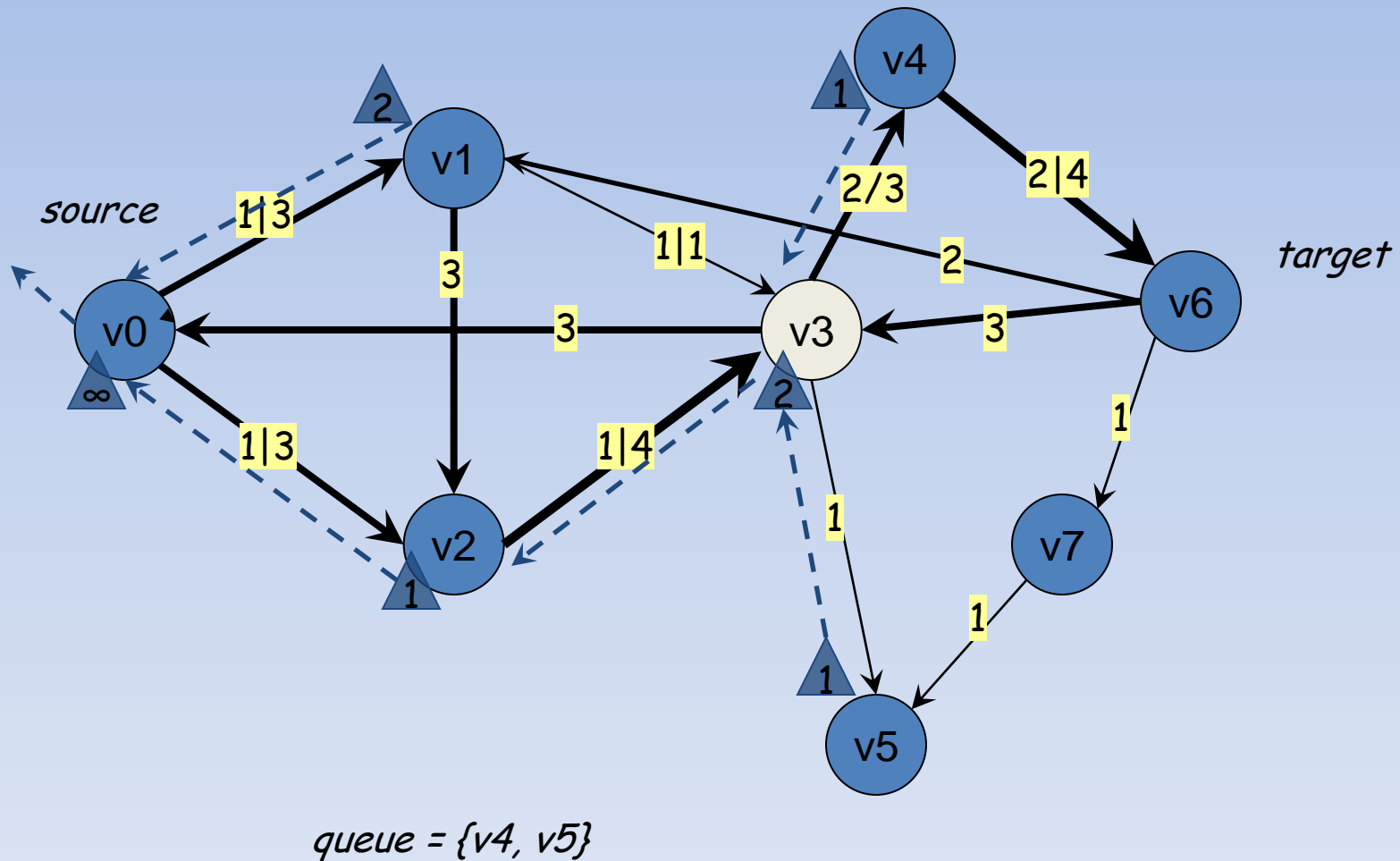
Application to Augmenting Path



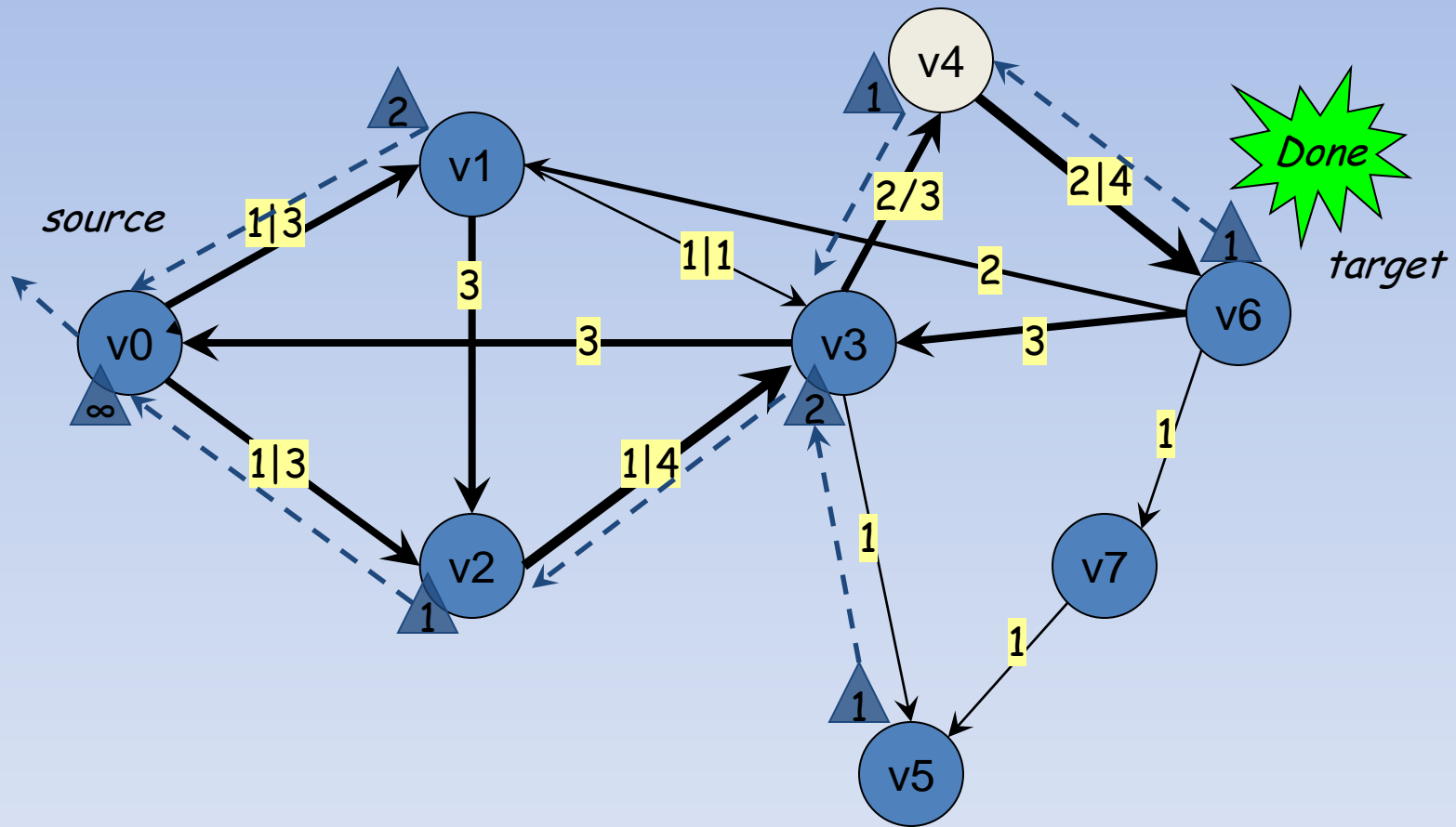
Application to Augmenting Path



Application to Augmenting Path



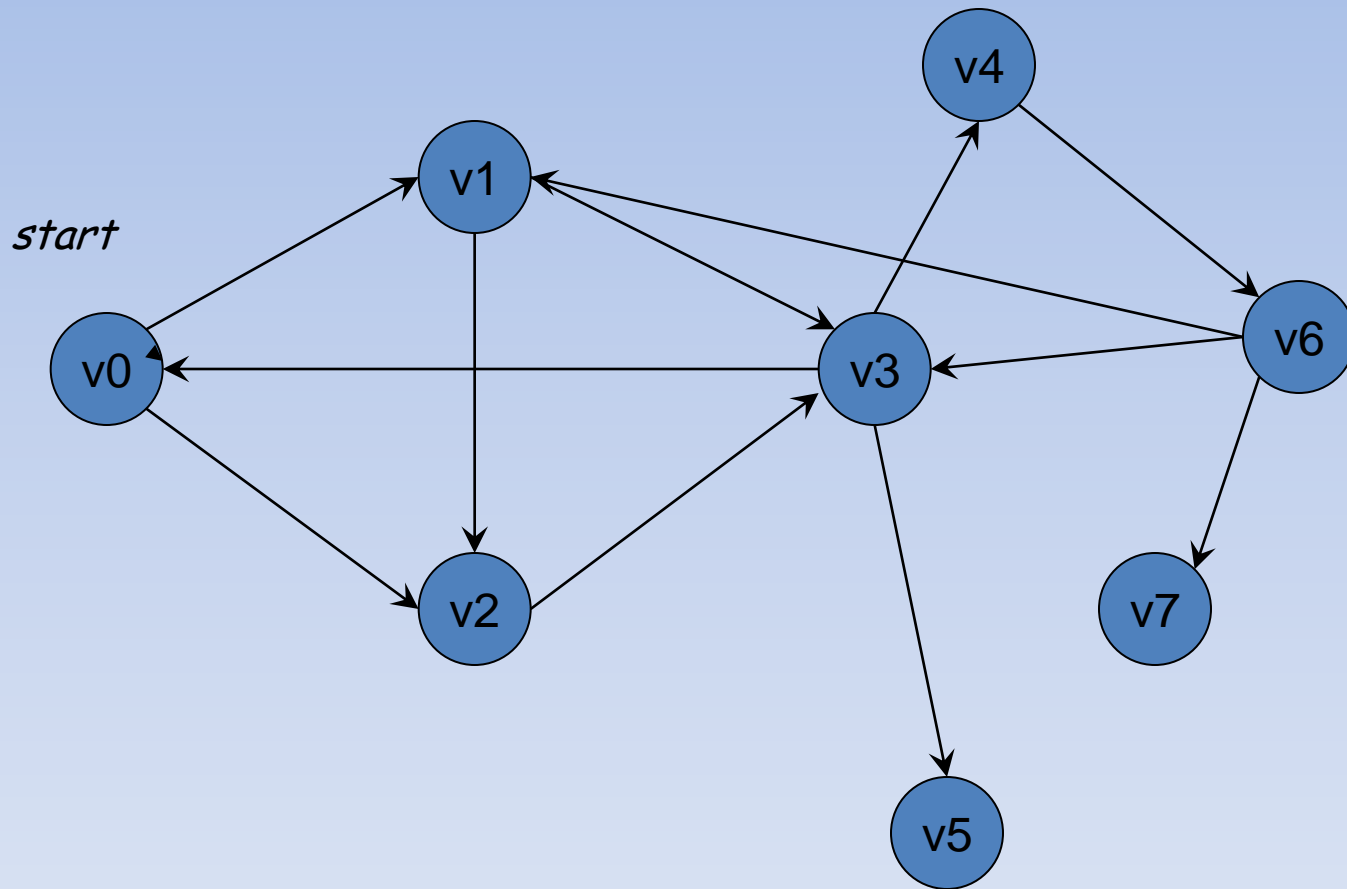
Application to Augmenting Path



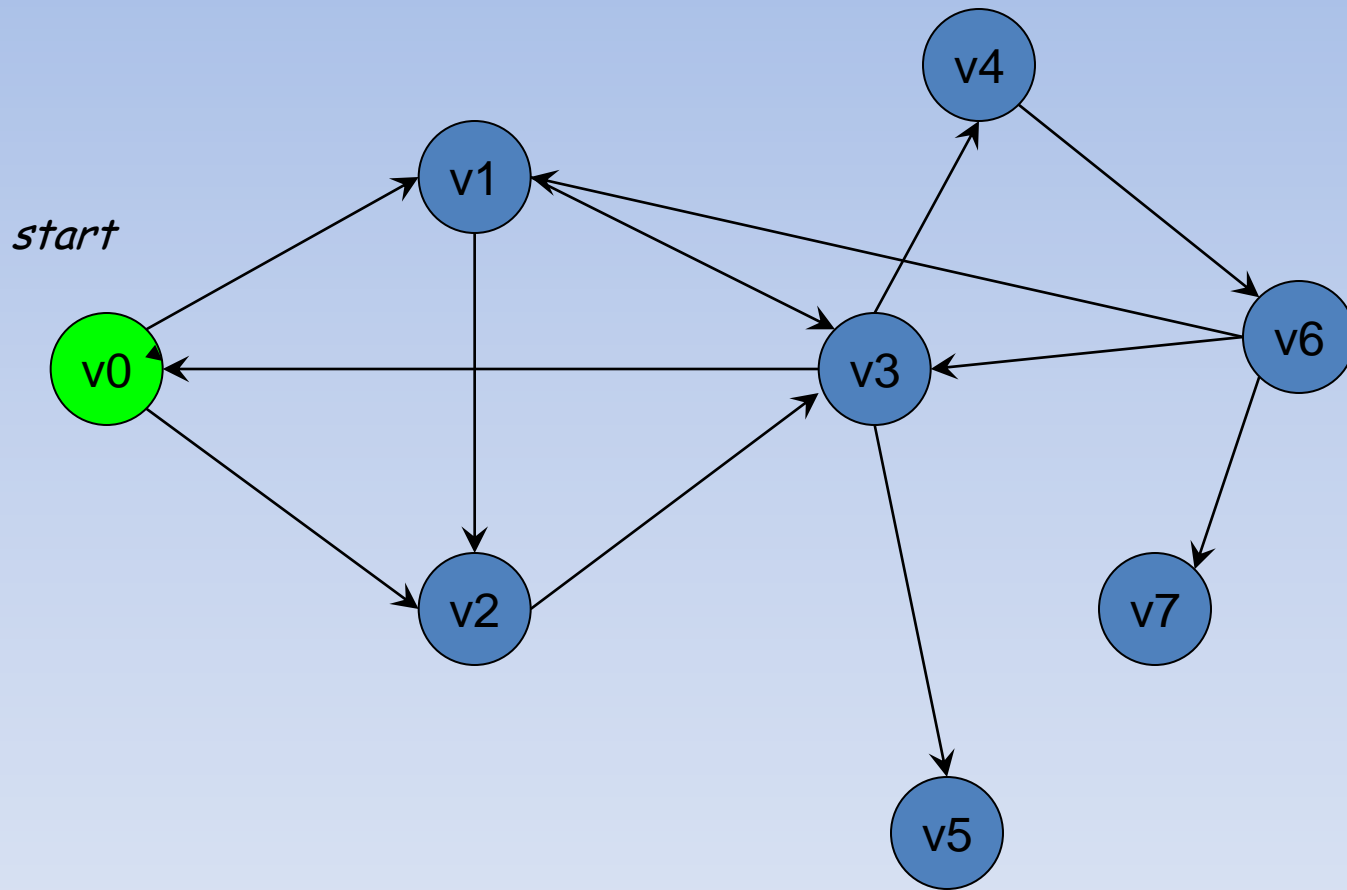
Breadth-first search

- The previous is an example
- Depth-first search is an alternative
- The code is nearly the same
- Only the queuing order differs

Breadth-first Search

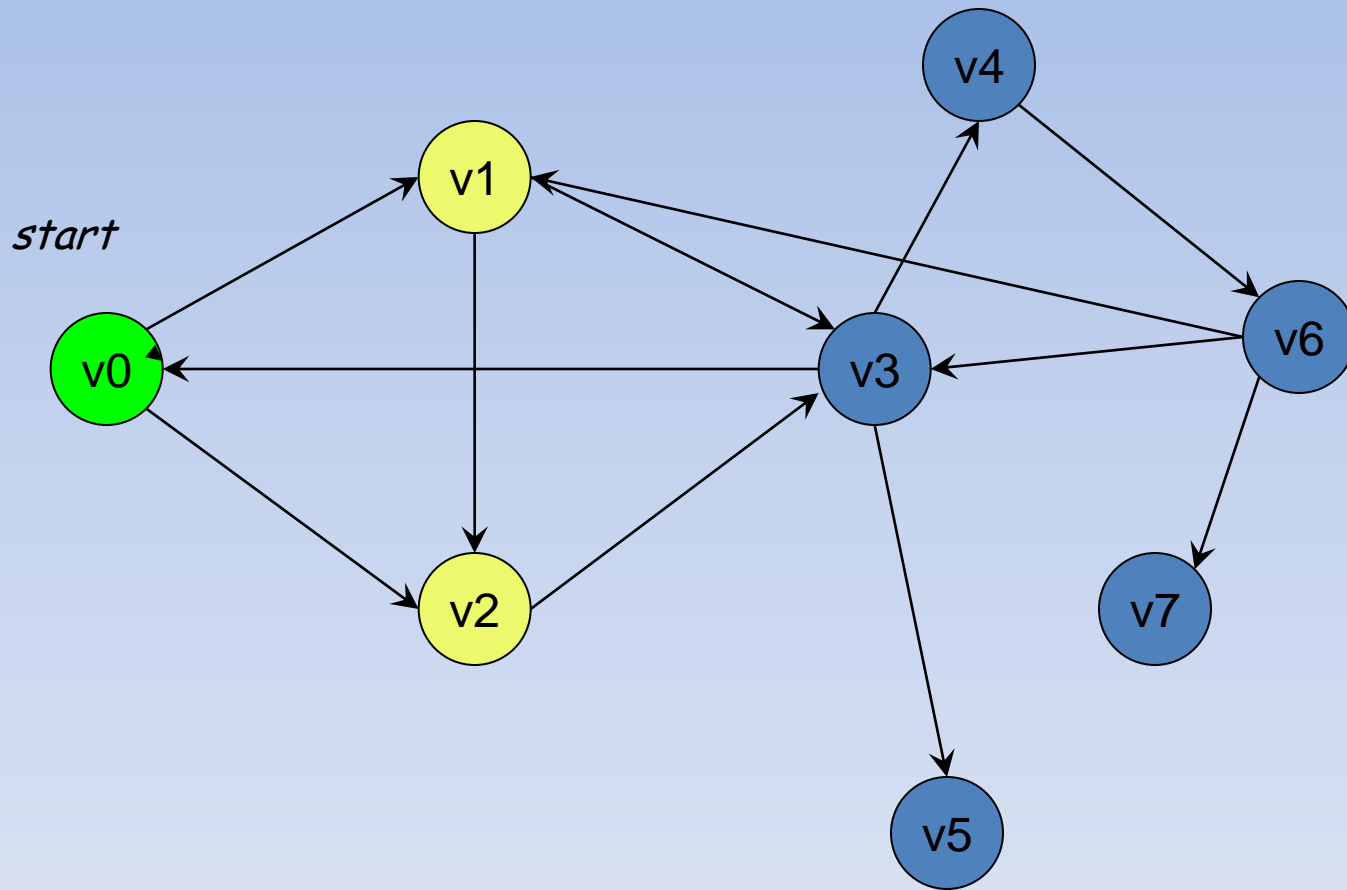


Breadth-first Search



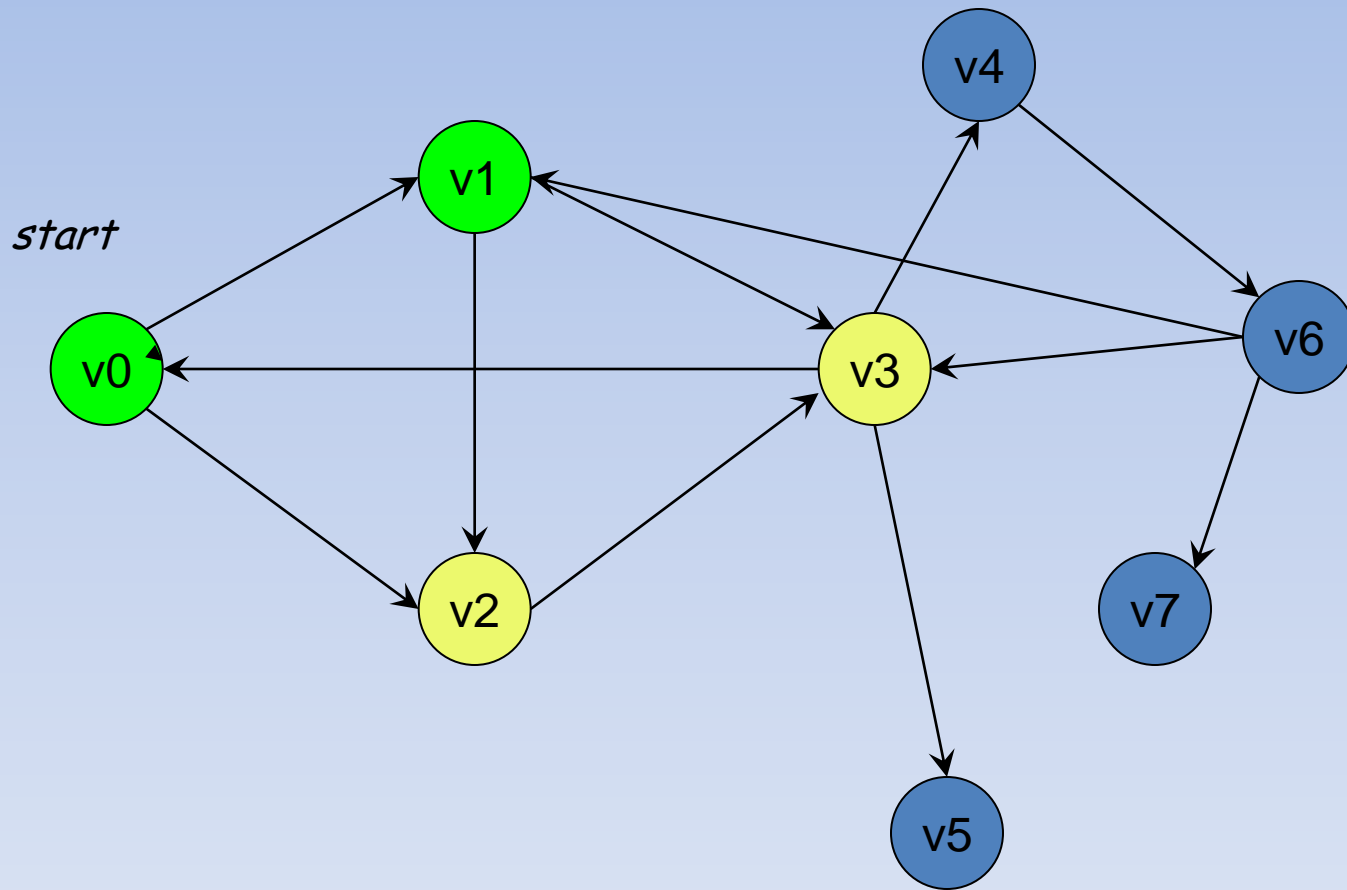
$ToVisit = \{ v_0 \}$

Breadth-first Search



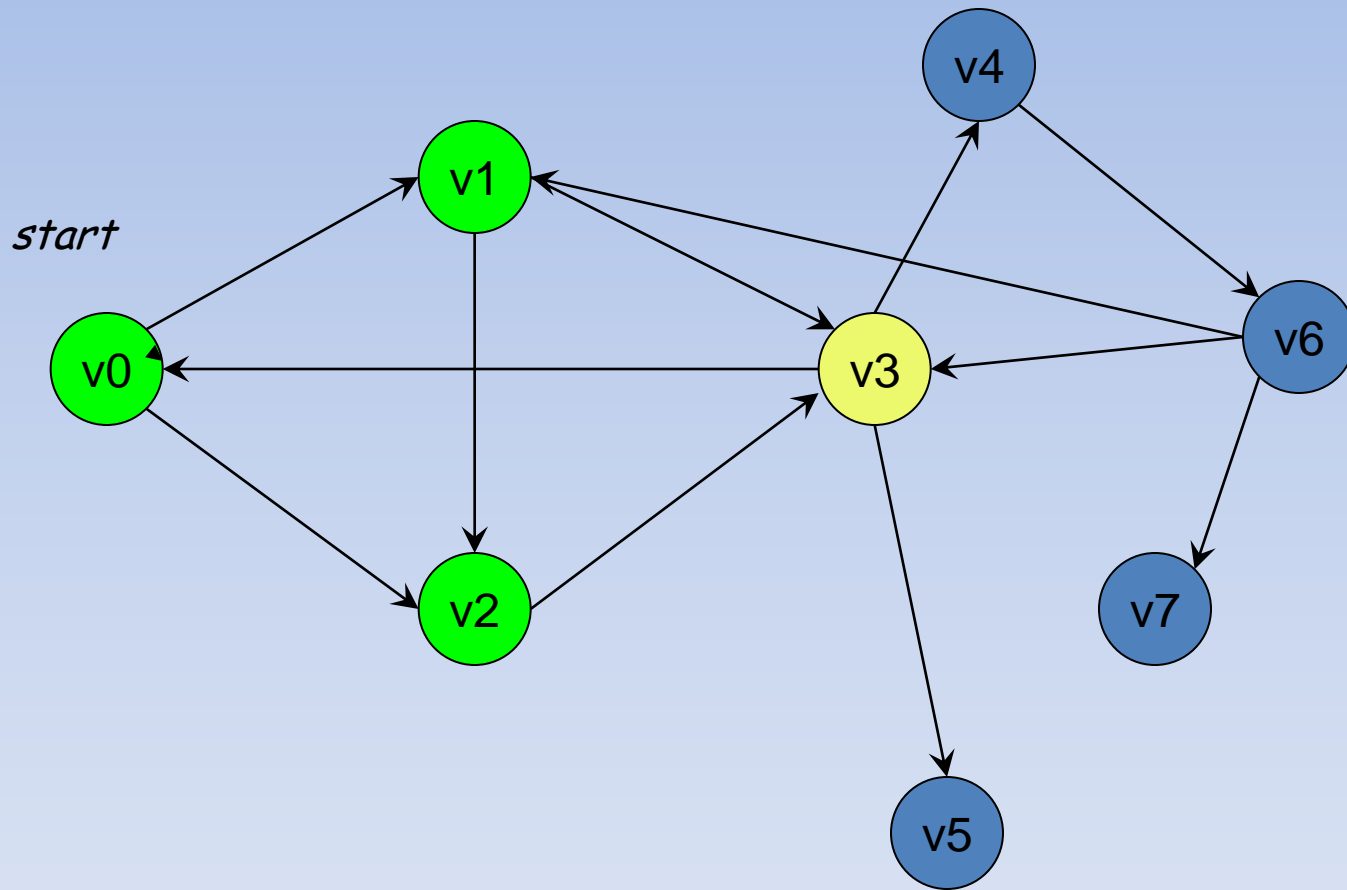
$ToVisit = \{ v_1, v_2 \}$

Breadth-first Search



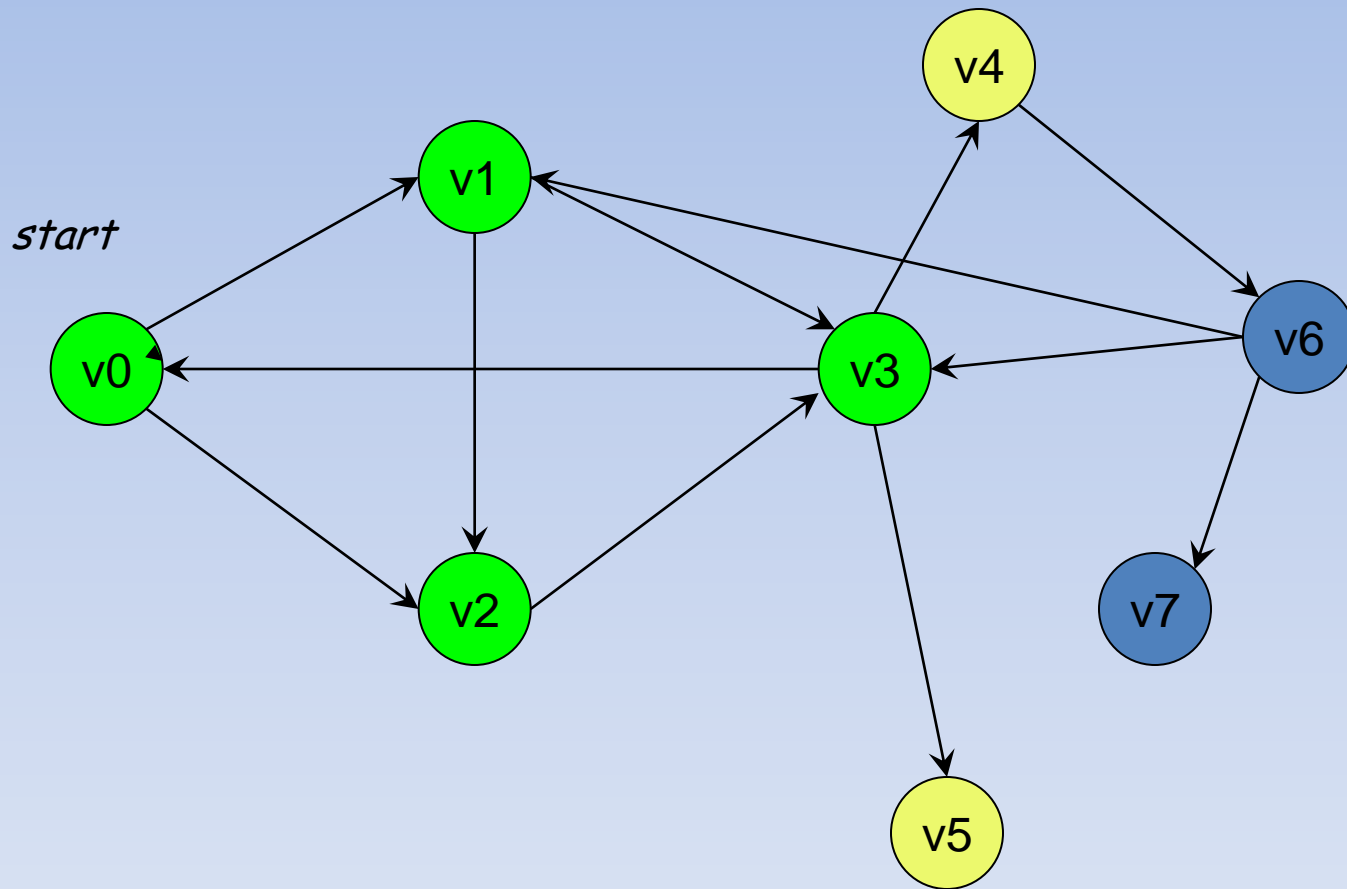
$ToVisit = \{ v_2, v_3 \}$

Breadth-first Search



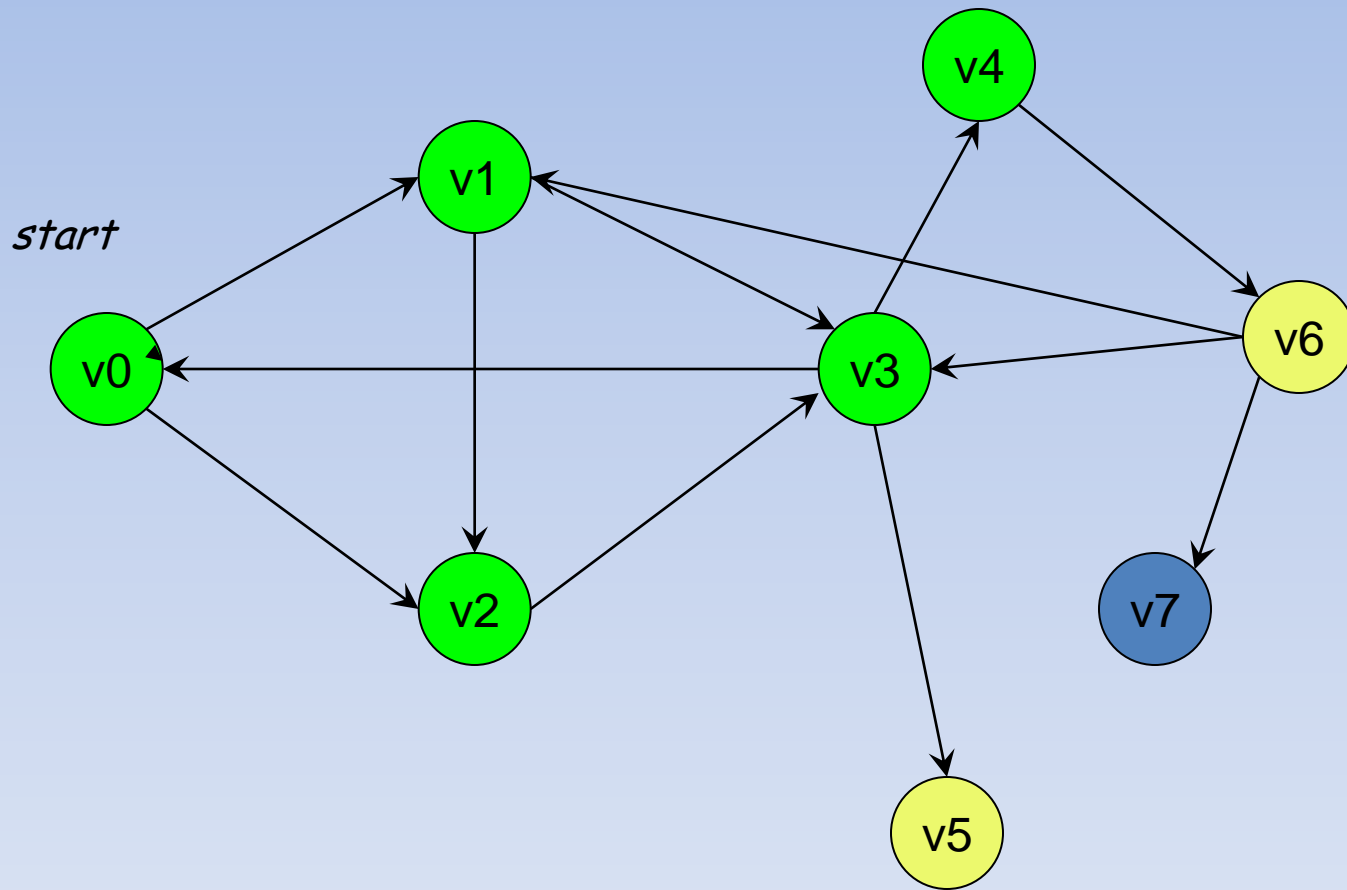
$ToVisit = \{ v_2, v_3 \}$

Breadth-first Search



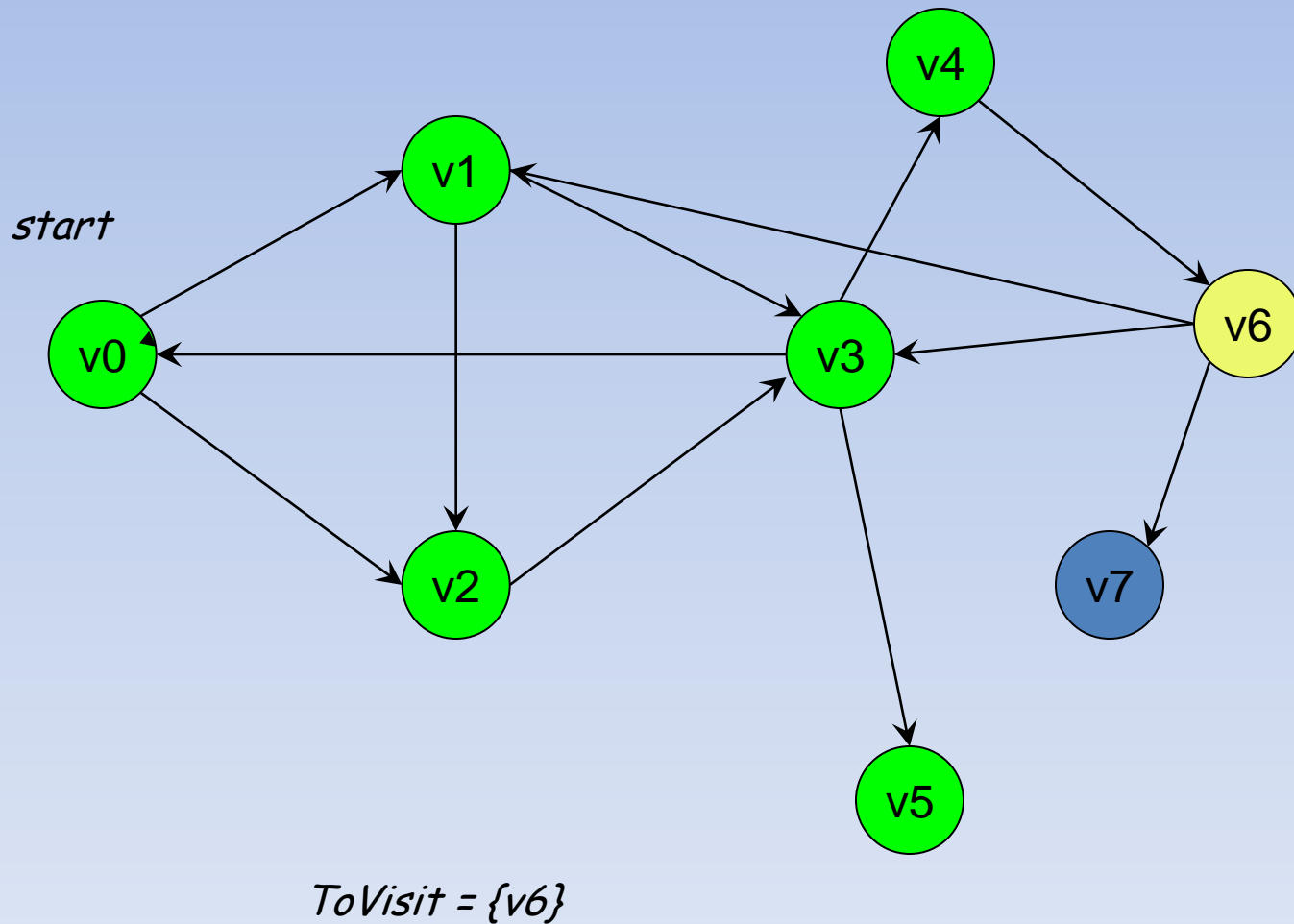
$ToVisit = \{v_4, v_5\}$

Breadth-first Search

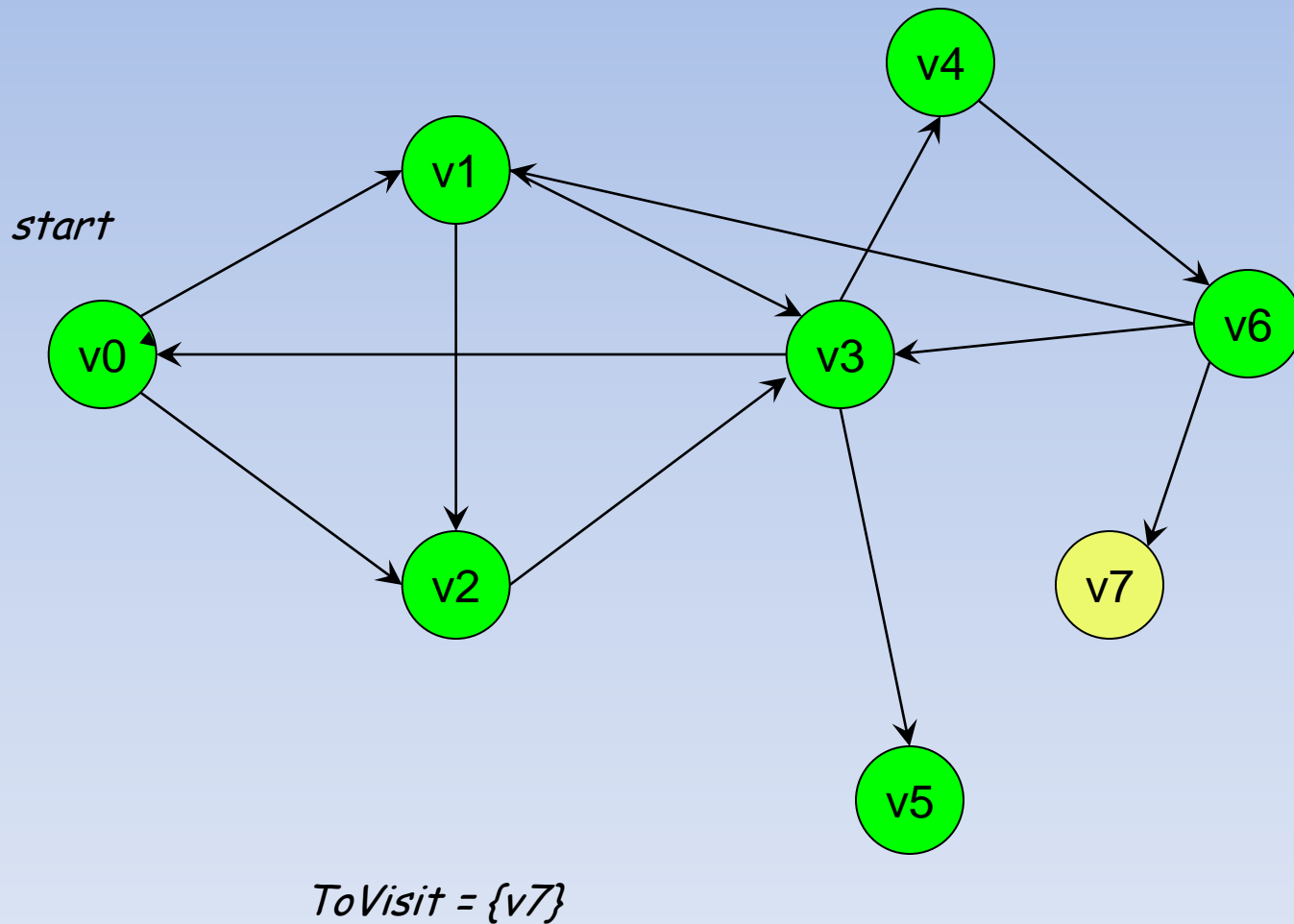


$ToVisit = \{ v_5, v_6 \}$

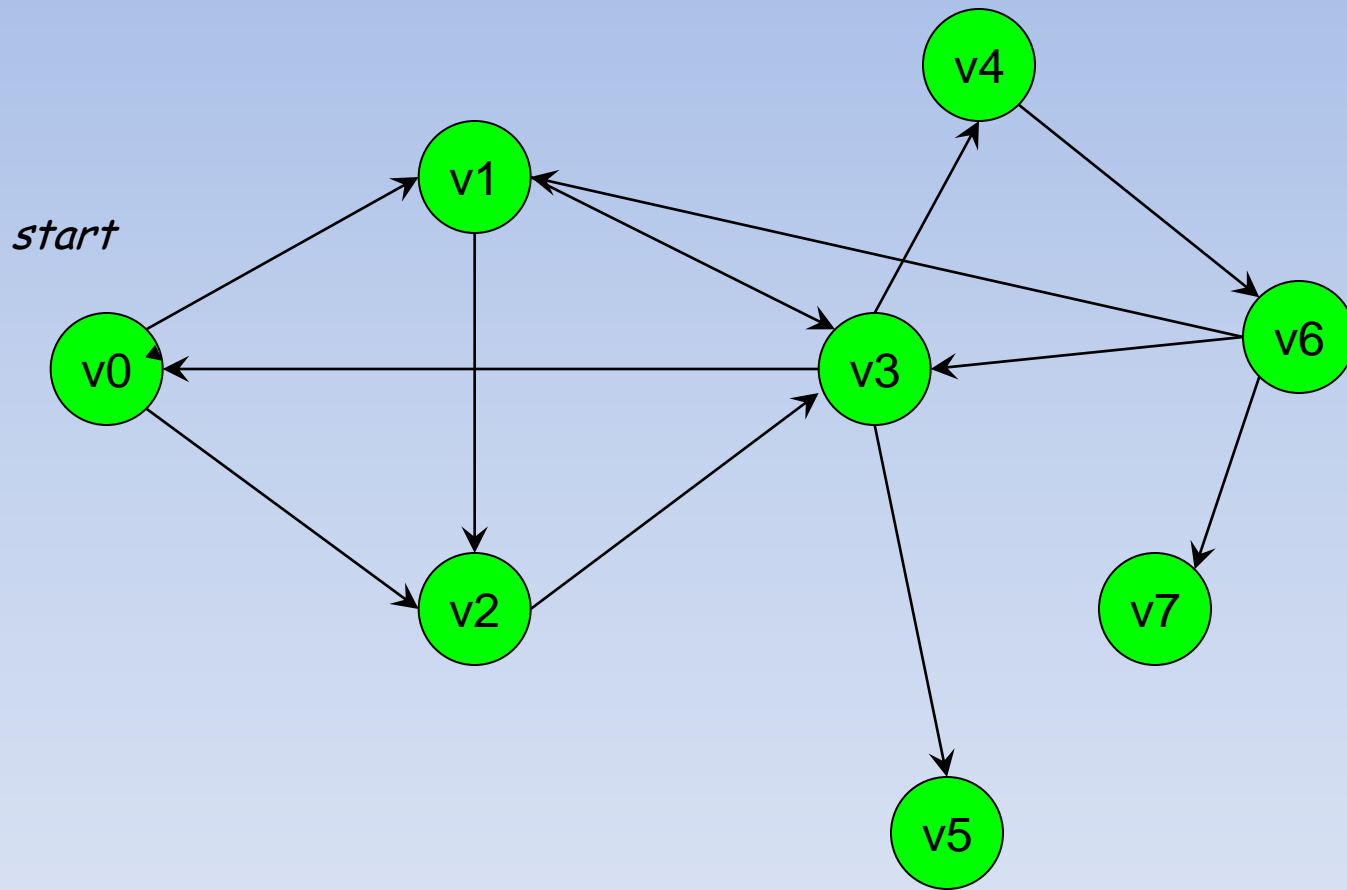
Breadth-first Search



Breadth-first Search



Breadth-first Search

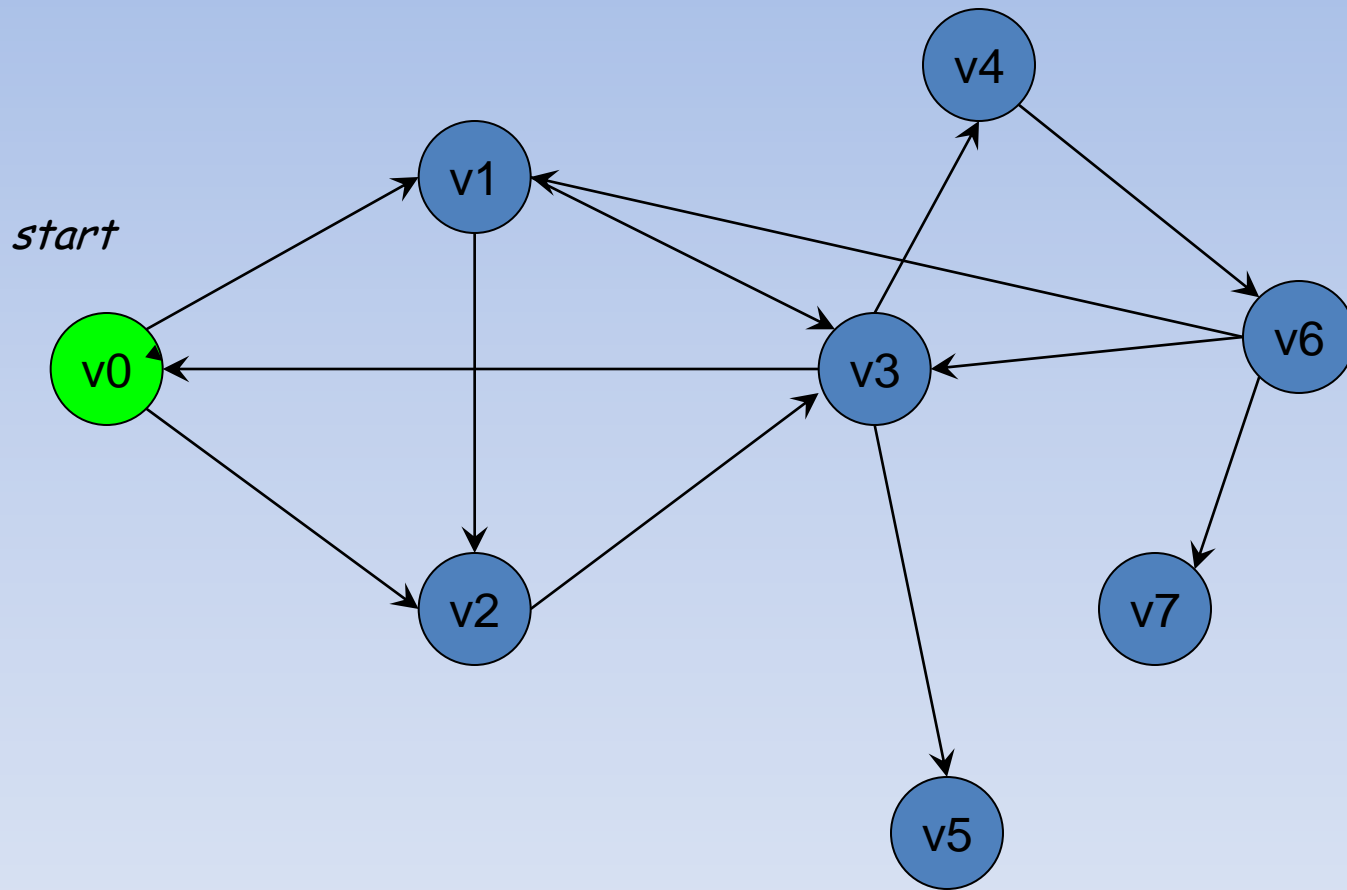


ToVisit = {}

Depth-first Search

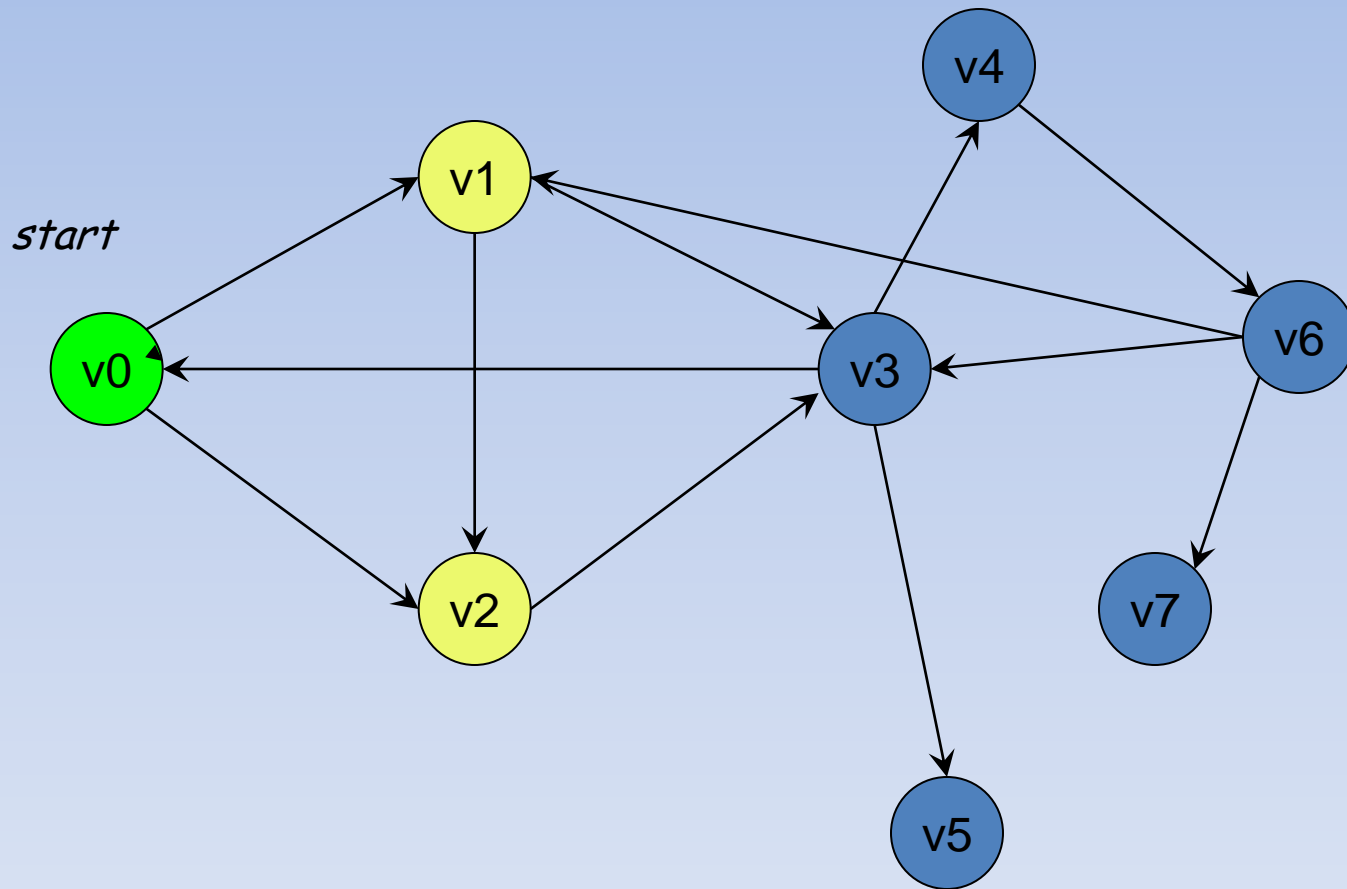
- Now see what happens if ToVisit is implemented as a stack (LIFO).

Depth-first Search



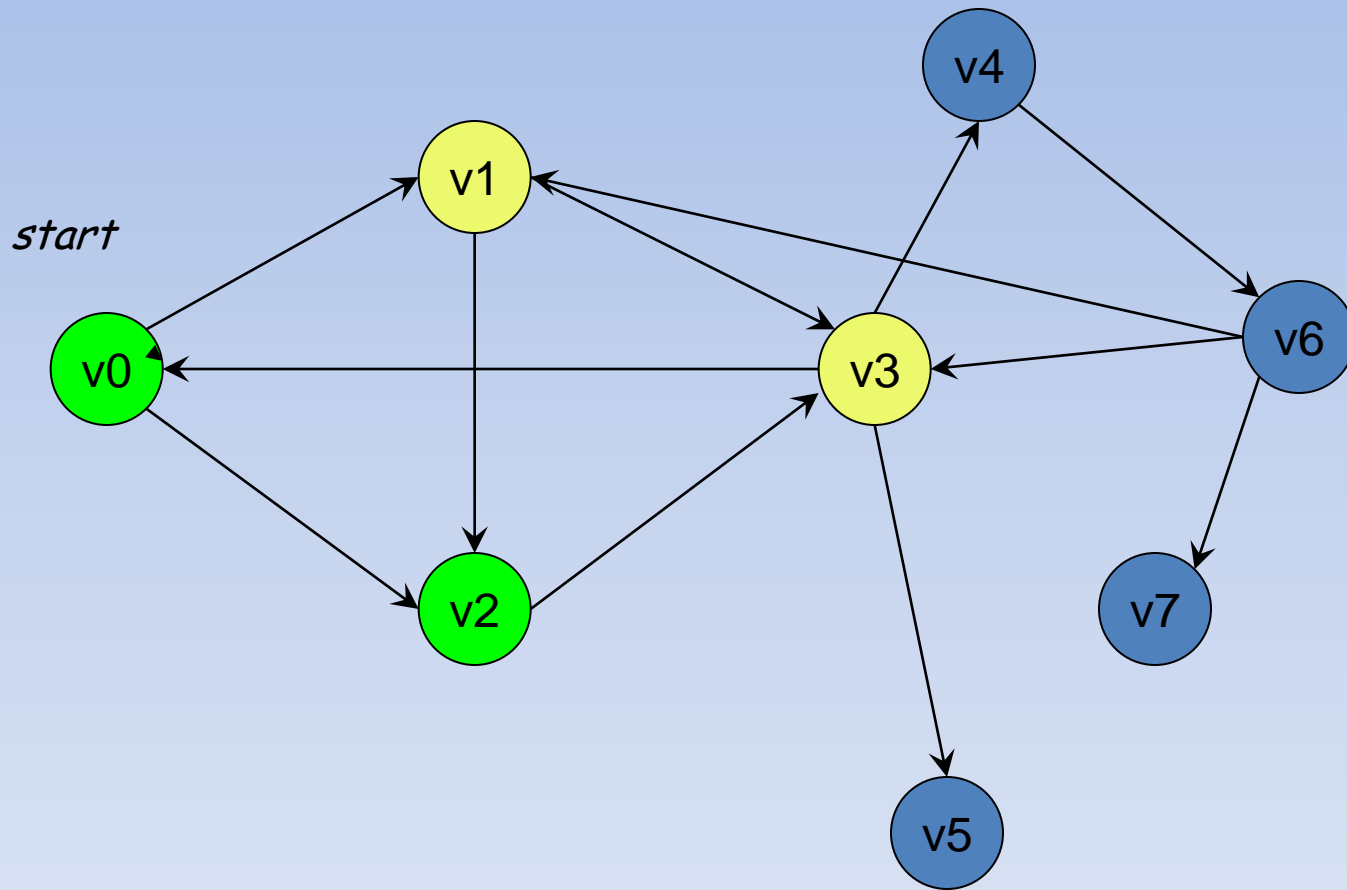
$ToVisit = \{ v_0 \}$

Depth-first Search



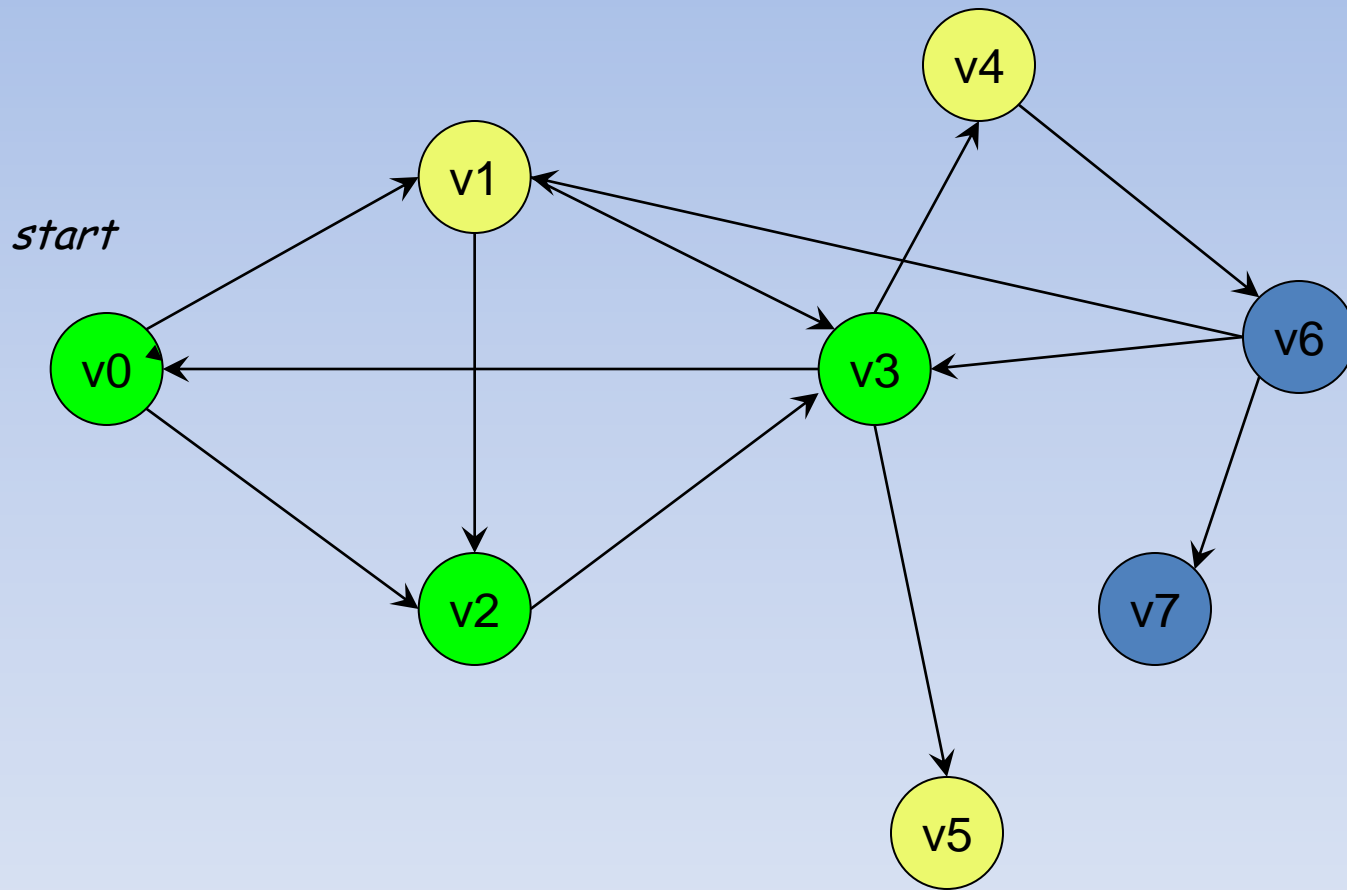
$ToVisit = \{v_1, v_2\}$

Depth-first Search



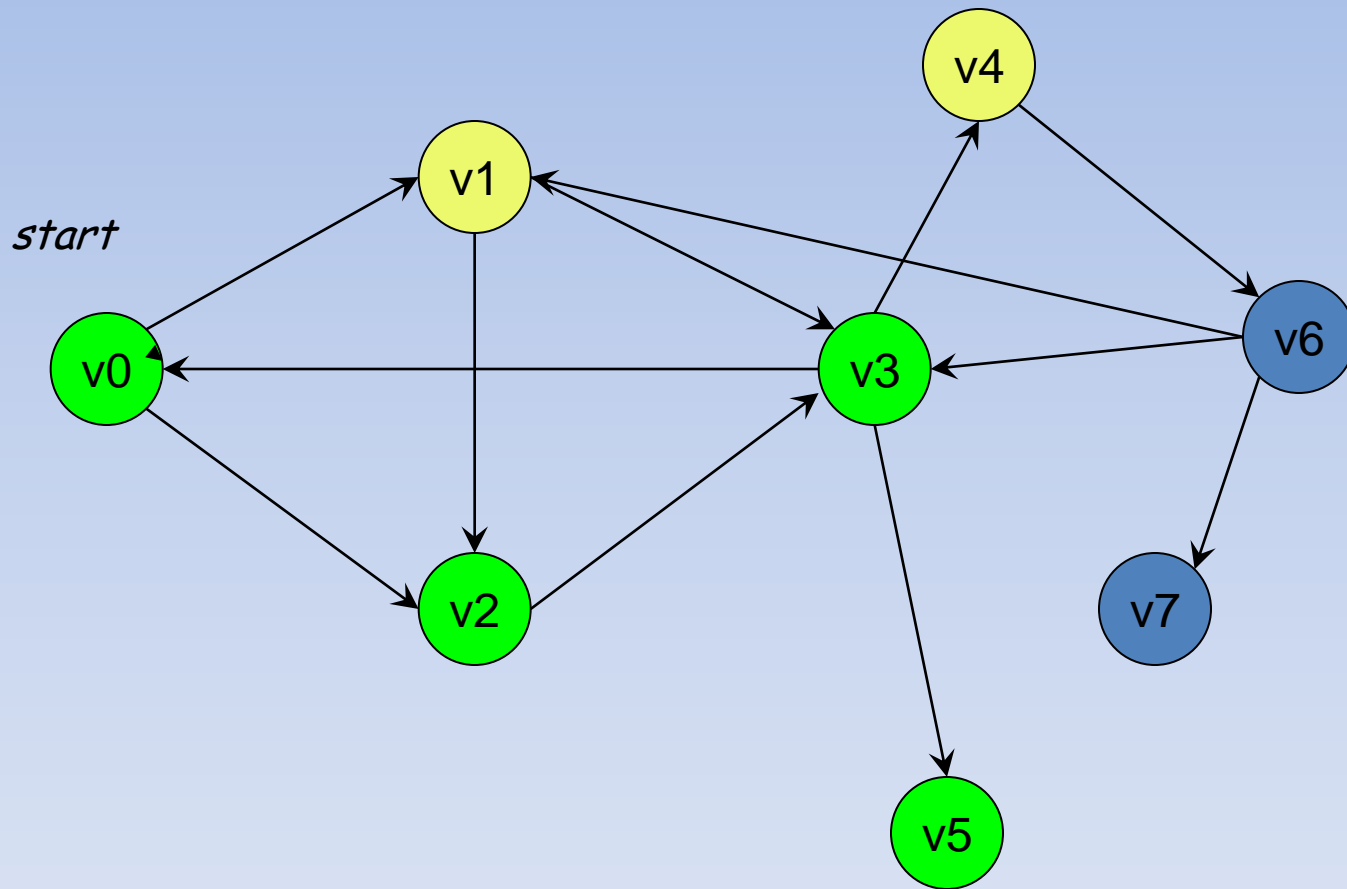
$ToVisit = \{ v1, v3 \}$

Depth-first Search



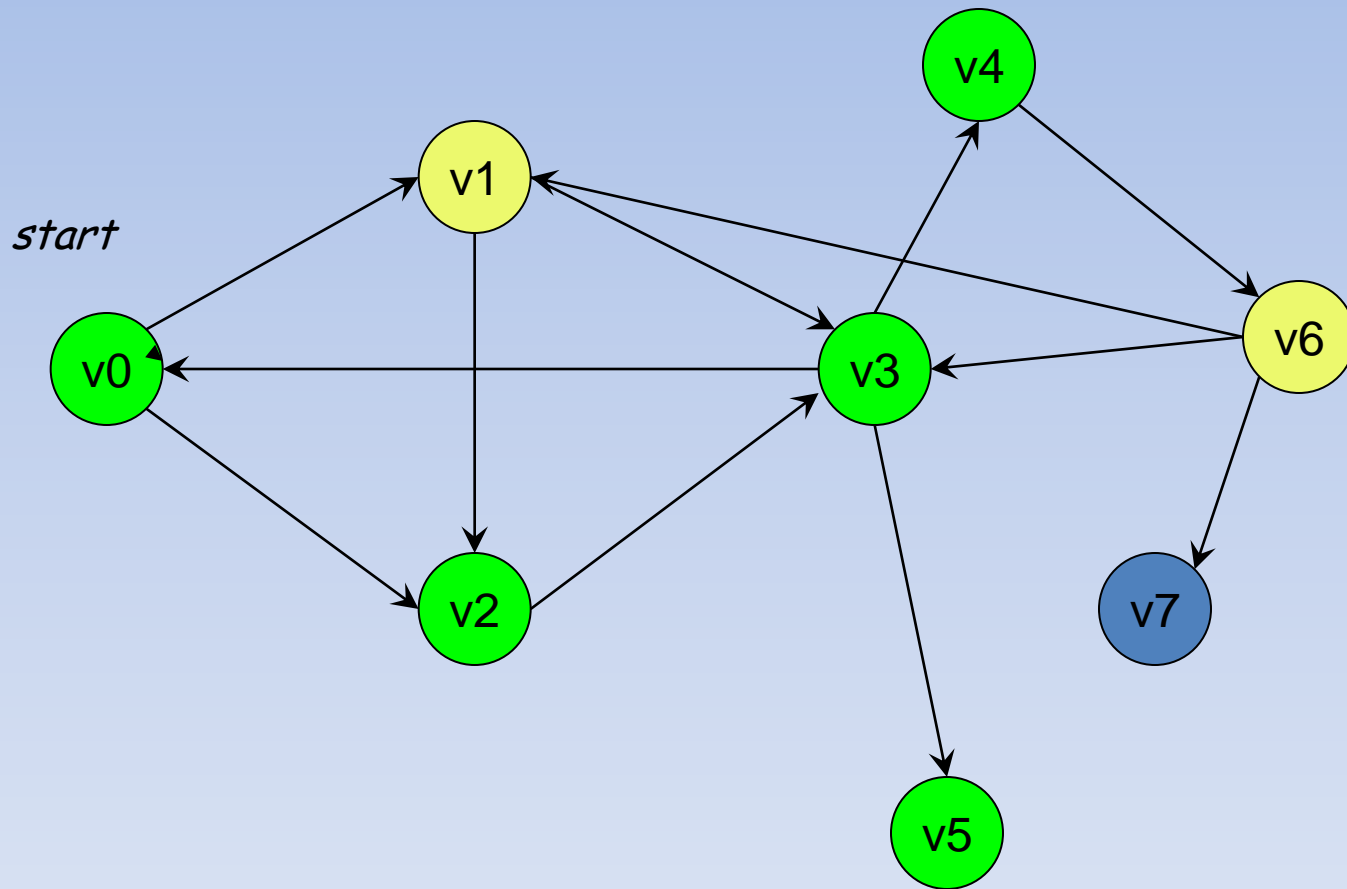
$ToVisit = \{ v_1, v_4, v_5 \}$

Depth-first Search



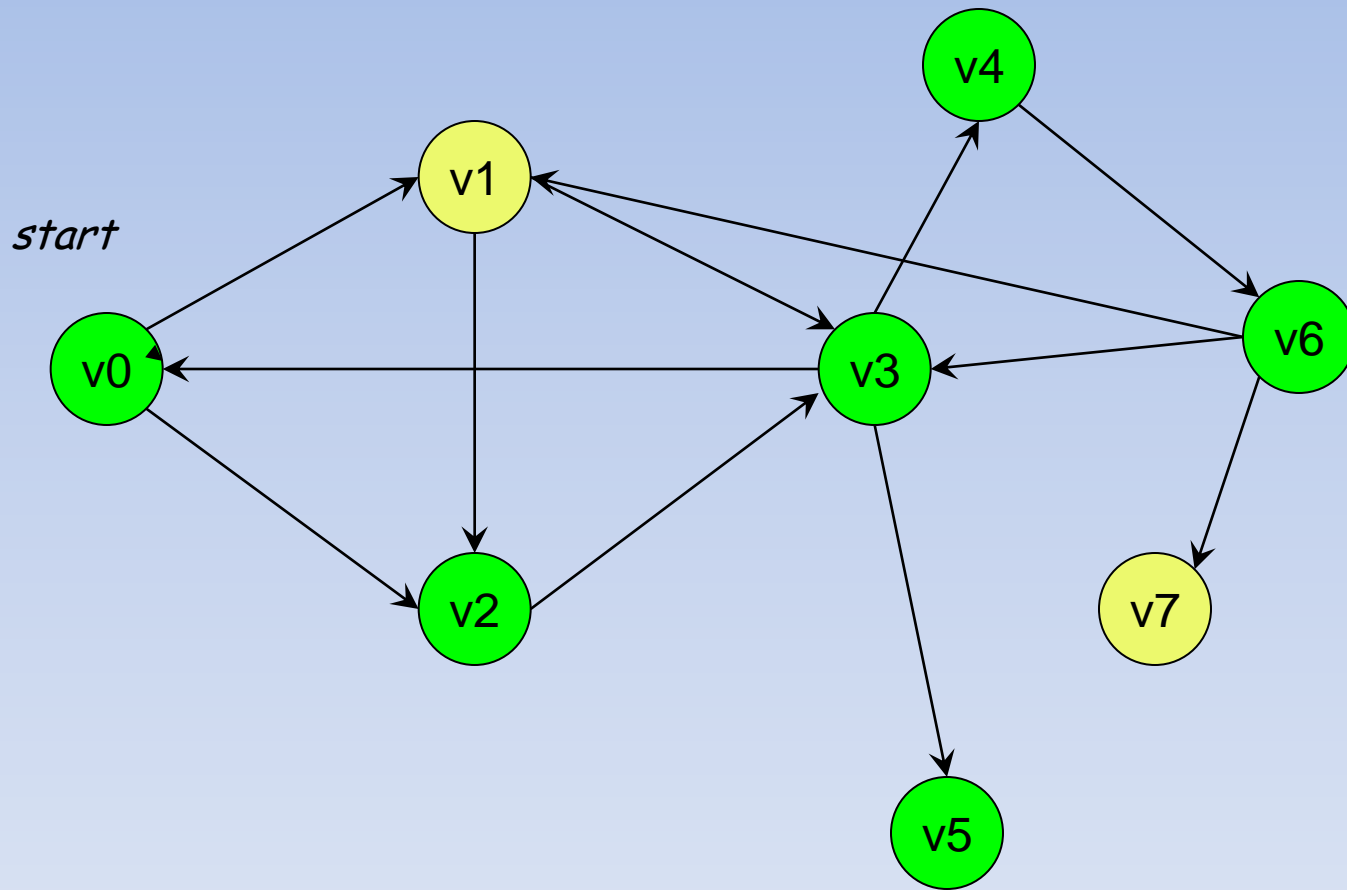
$ToVisit = \{ v_1, v_4 \}$

Depth-first Search



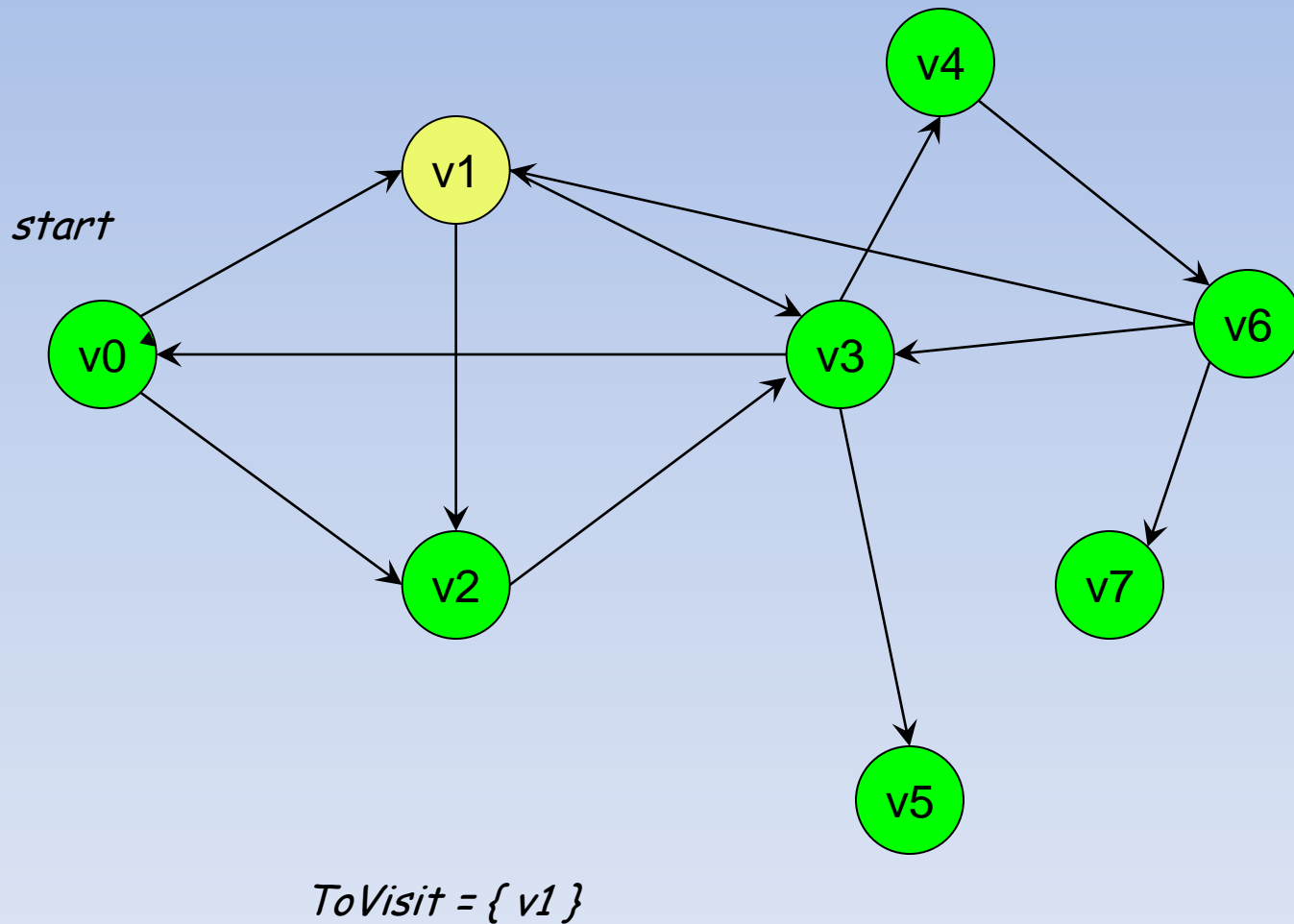
$ToVisit = \{ v_1, v_6 \}$

Depth-first Search

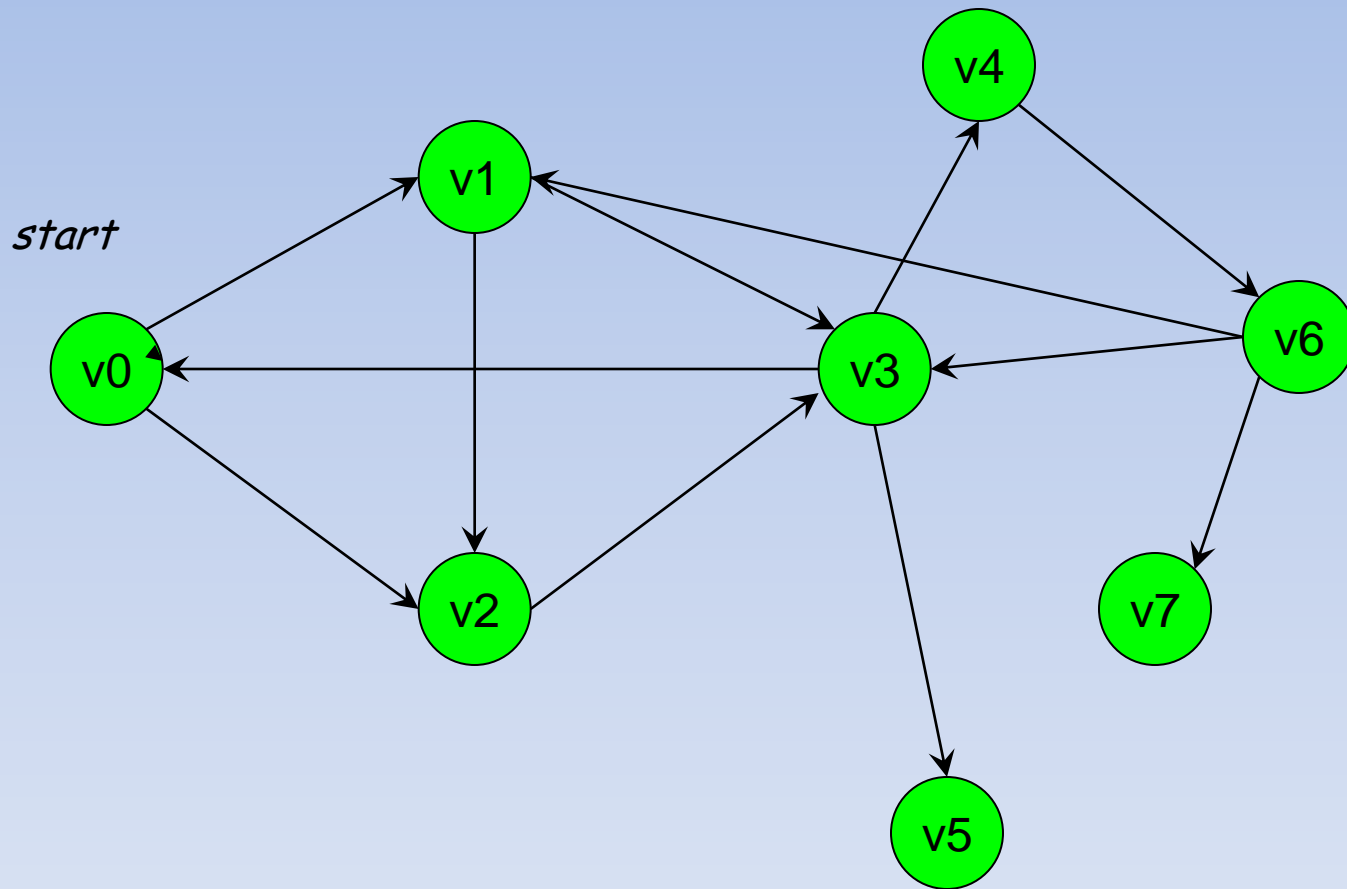


ToVisit = { v_1 , v_7 }

Depth-first Search



Depth-first Search

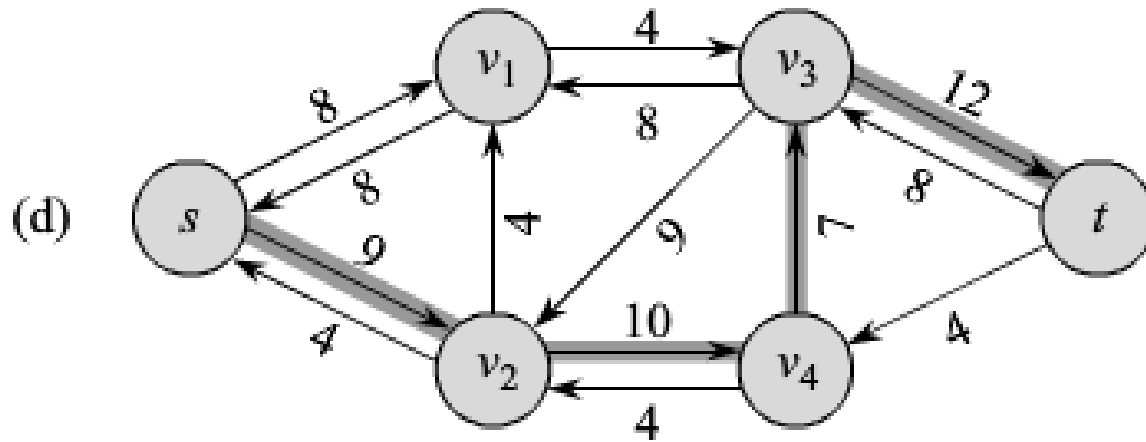


$ToVisit = \{ \}$

Analysis

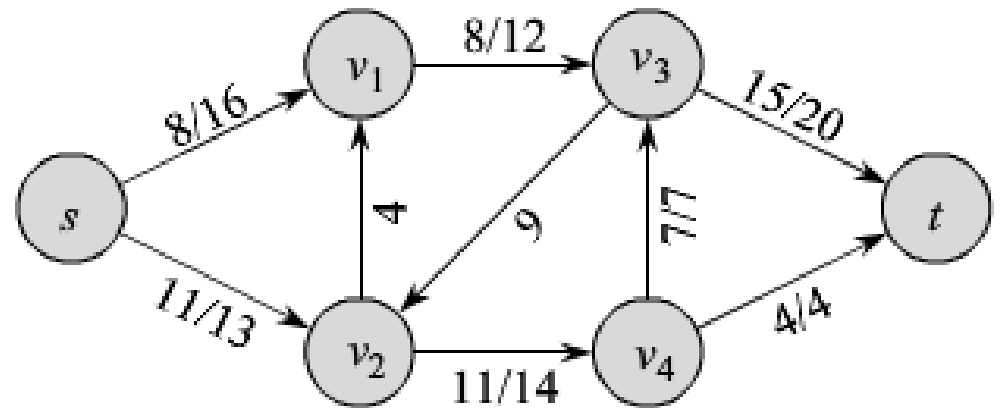
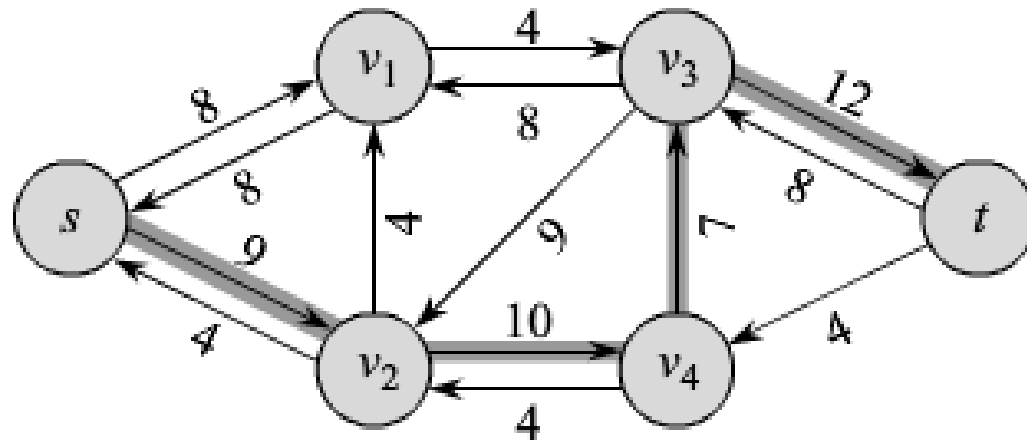
- Each iteration adjusts flow by at least 1
- $O(E |f^*|)$

Example

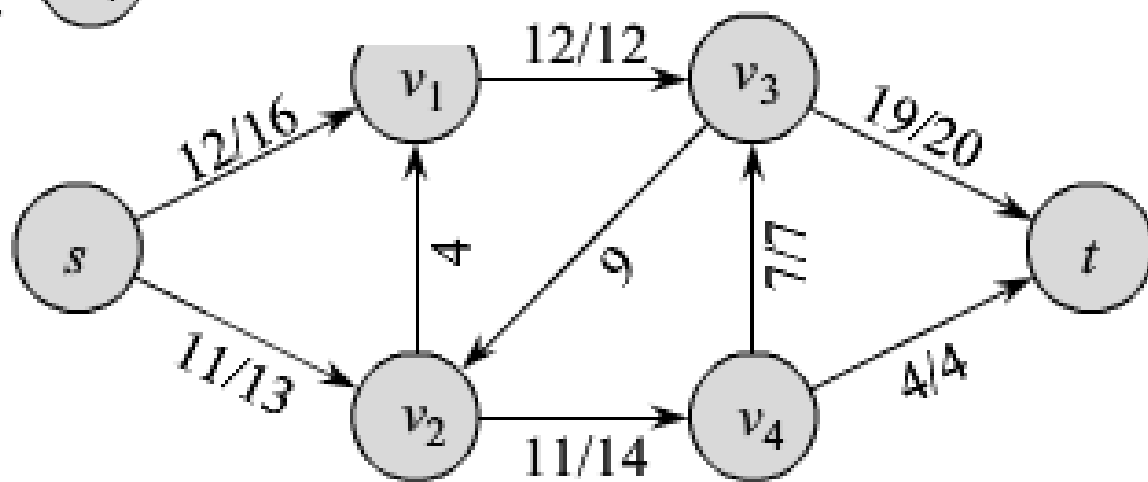
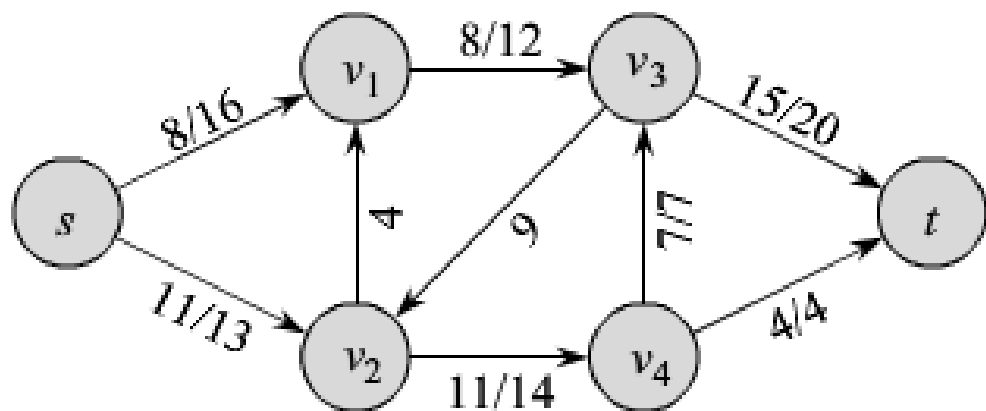
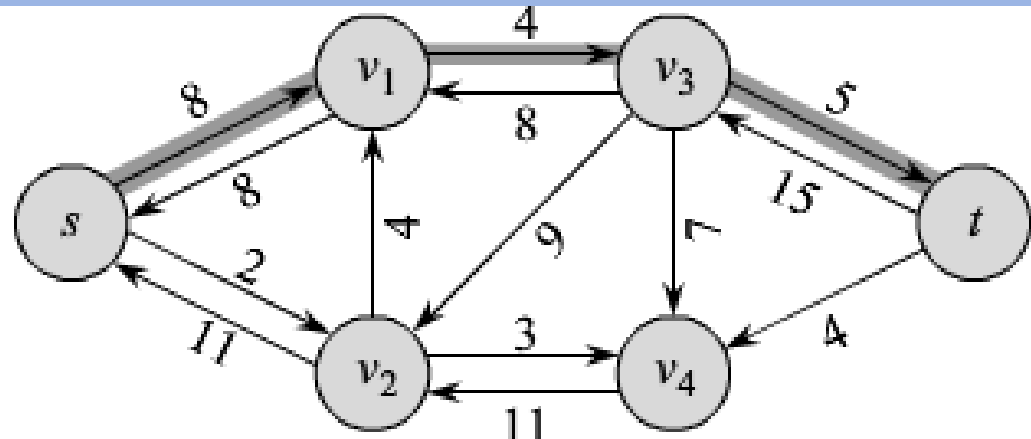


Example

(d)



(e)



No Augmentation Paths

