



Maximum Flow Algorithms

Network Algorithms

Georgia Kaouri

A decorative graphic on the left side of the slide features a light green balloon at the top, a light blue balloon in the middle, and a light purple balloon at the bottom. Each balloon is attached to a streamer and has several small yellow triangular flags hanging from it. The background is white.

Contents

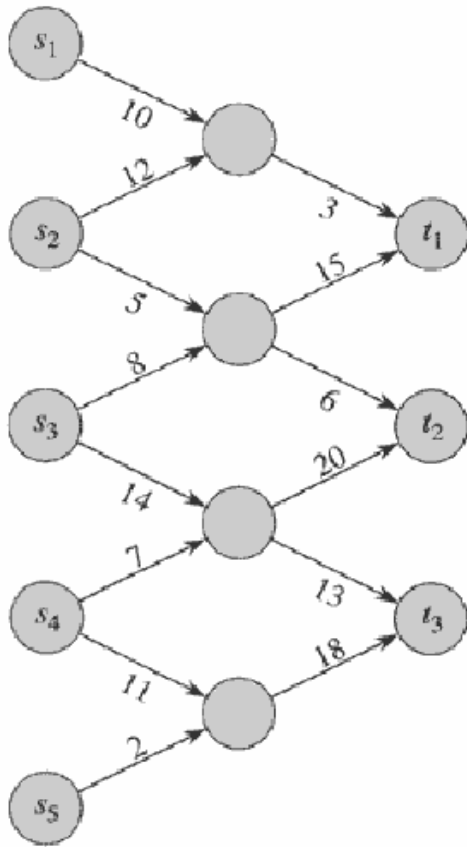
- Applications, special cases
- Flow networks
- Ford Fulkerson algorithm
- Preflow - push algorithms
- Lift - to - front algorithm



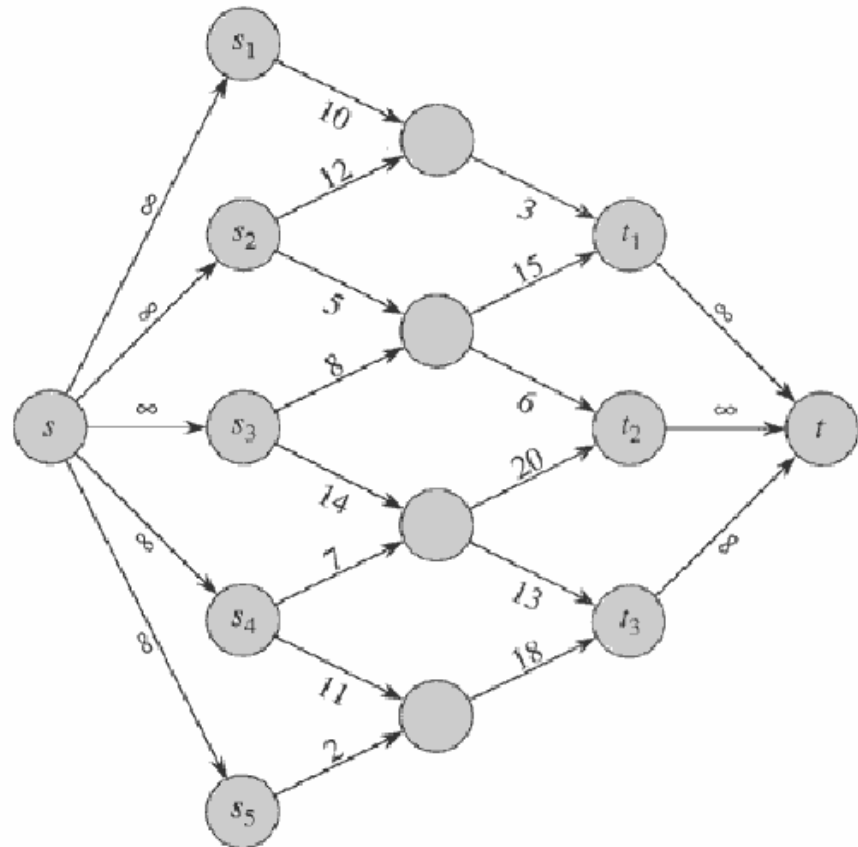
Applications

- Material flows
- Model liquids flowing, current through electrical networks, information through communication networks, etc
- Maximum matching in bipartite graphs

Special case: multiple source, multiple sink maximum flow - problem



(a)



(b)



Problem Definition

Input: A connected, directed graph $G = (V, E)$ in which each edge $(u, v) \in E$ has a non negative capacity $c(u, v) \geq 0$. There is a node $s \in V$ (source), s.t. for all $u_i \in V$ $c(u_i, s) = 0$ and $t \in V$ (target), s.t. for all $u_i \in V$ $c(t, u_i) = 0$.

Output: A maximum flow from s to t .



Flow

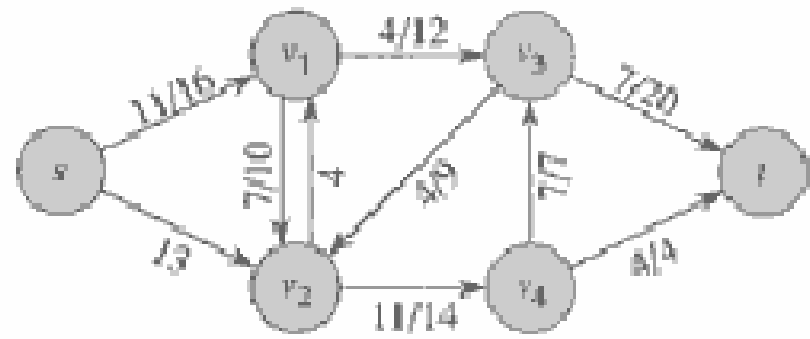
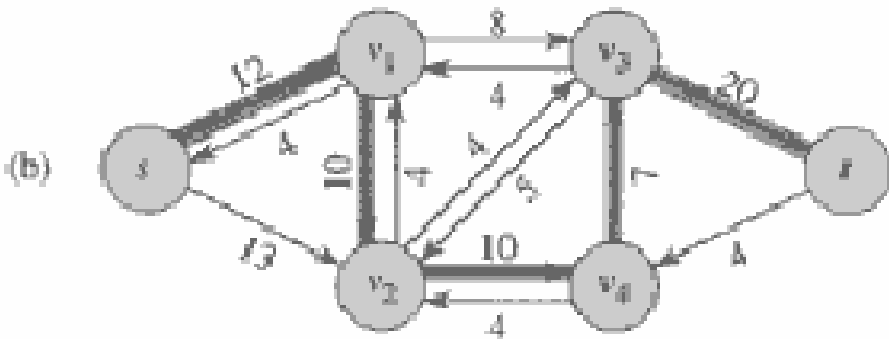
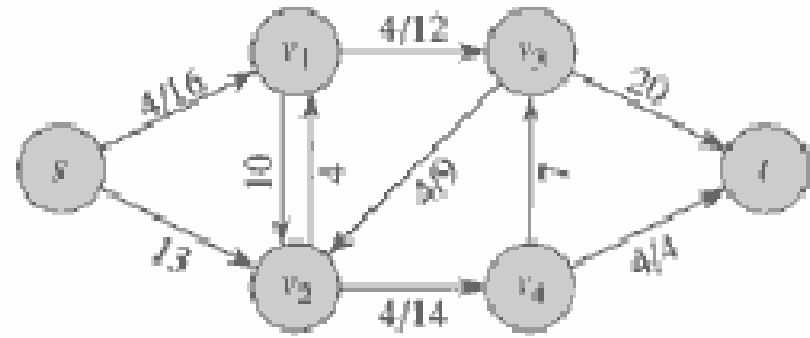
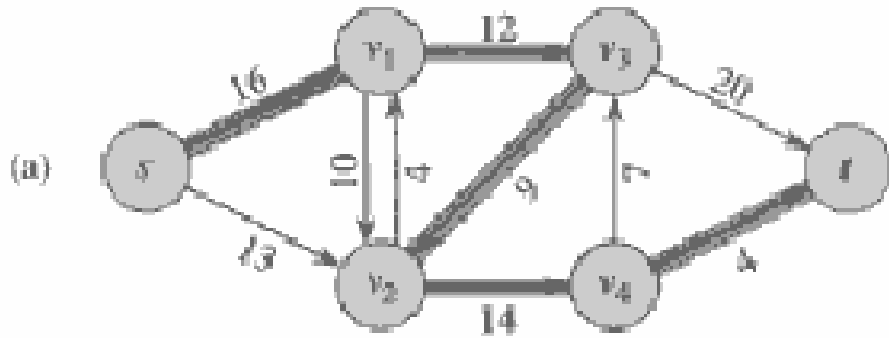
A flow in G is a real valued function $f: V \times V \rightarrow \mathbb{R}$ that satisfies the following properties:

Capacity constraint: For all $u, v \in V$, we require
 $f(u, v) \leq c(u, v)$

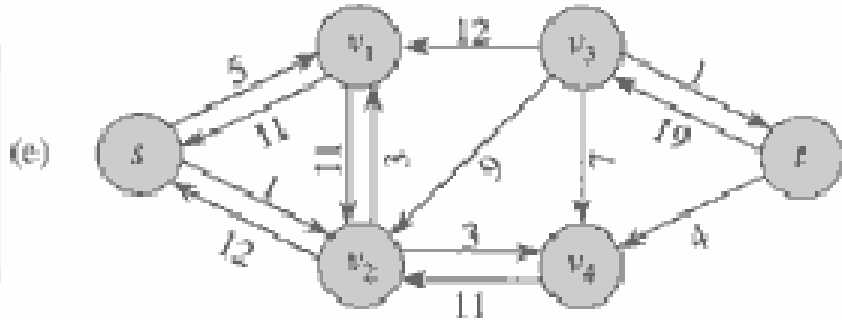
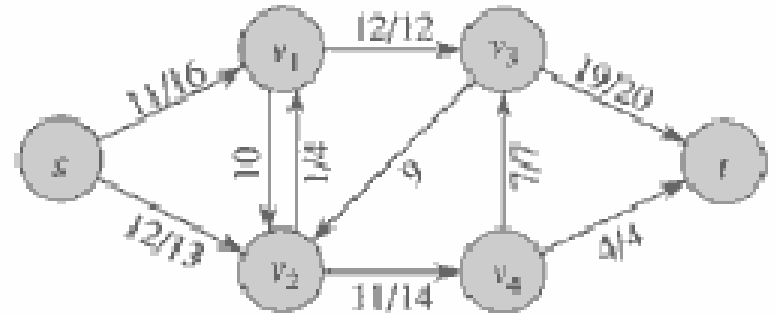
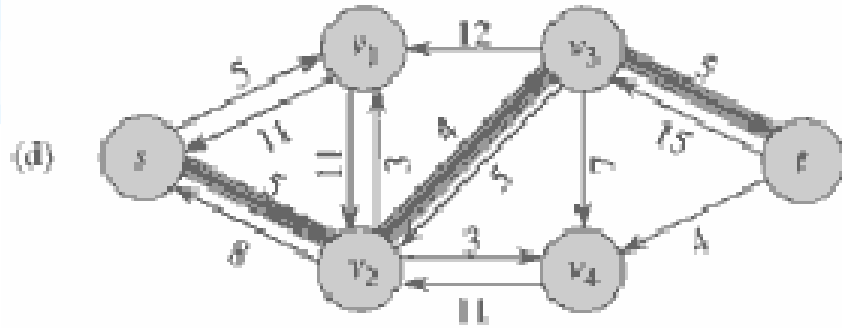
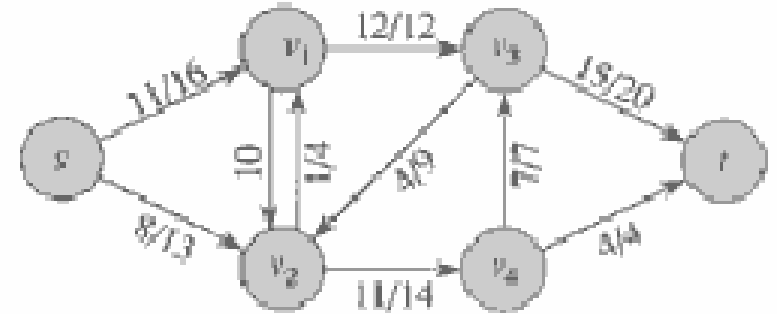
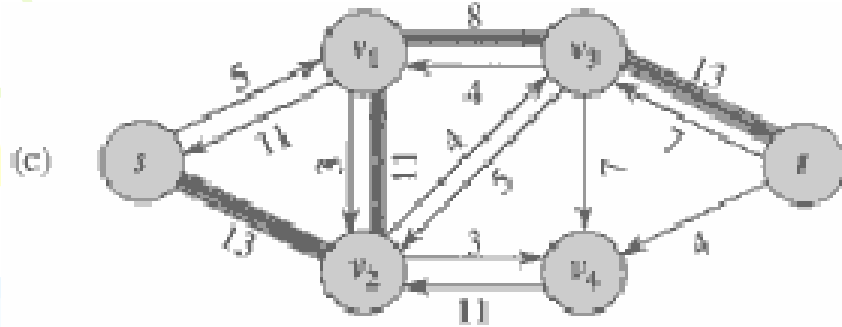
Skew symmetry: For all $u, v \in V$, we require
 $f(u, v) = -f(v, u)$

Flow conservation: For all $u \in V - \{s, t\}$, we
require $\sum_{v \in V} f(u, v) = 0$

Ford - Fulkerson method (G, s, t)



Ford - Fulkerson method (G, s, t)





Edmonds - Karp algorithm

Modify the Ford - Fulkerson algorithm so that the augmenting path is a shortest path from s to t in the residual network.

Ford - Fulkerson: $O(E |f^*|)$

Edmonds - Karp: $O(VE^2)$

Preflow - Push algorithm

- Preflow - push algorithms work on one vertex at a time and its neighbors.
- Flow conservation property is not maintained.
- A preflow is maintained.

Preflow is a function $f:V \times V \rightarrow \mathbb{R}$ that satisfies skew symmetry, capacity constraints and the following relaxation of flow conservation: $f(V, u) \geq 0$ for all vertices $u \in V$ -s.

Excess flow into u is the net flow into a vertex given by $e(u) = f(u, V)$. If $e(u) > 0$, vertex u is overblowing.



Intuition

- Edges are like water pipes
- Nodes are joints
- Distance is like height from the ground.
 - Destination is at the ground.
- Initially source is at the highest level and sends water to all adjacent nodes.
- Whenever a node has accumulated water, it sends (**pushes**) water to nodes at lower label.
- So water moves towards the destination
- Sometimes water gets locally trapped as all neighboring nodes are at a greater height.
- Then, the node label is raised (**relabelling**).

Heights

Let $G = (V, E)$ be a flow network with source s and target t and let f be a preflow in G . A function $h: V \rightarrow \mathbb{N}$ is a height function if $h(s) = |V|$, $h(t) = 0$ and $h(u) \leq h(v) + 1$ for every residual edge $(u, v) \in E_f$.

It follows that if for two vertices $u, v \in V$ $h(u) > h(v) + 1$, then (u, v) is not in the residual graph.

Basic Operations: Push

If u is overflowing ($e(u) > 0$), $c_f(u, v) > 0$ and $h(u) = h(v) + 1$, we can PUSH

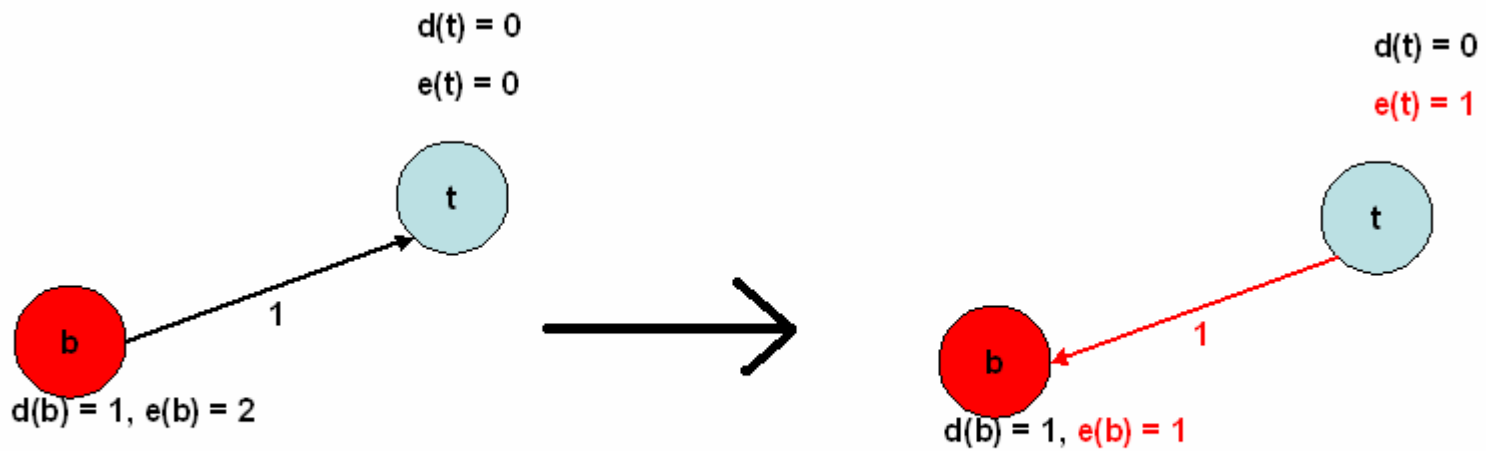
$d_f(u, v) = \min\{e(u), c_f(u, v)\}$ units of flow.

Then we have to update:

- $f(u, v), f(v, u)$
- $e(u)$
- $e(v)$

We call edge (u, v) an admissible edge.

Example



Code for Push operation

PUSH(u, v)

- 1 **▷ Applies when:** u is overflowing, $c_f(u, v) > 0$, and $h[u] = h[v] + 1$.
- 2 **▷ Action:** Push $d_f(u, v) = \min(e[u], c_f(u, v))$ units of flow from u to v .
- 3 $d_f(u, v) \leftarrow \min(e[u], c_f(u, v))$
- 4 $f[u, v] \leftarrow f[u, v] + d_f(u, v)$
- 5 $f[v, u] \leftarrow -f[u, v]$
- 6 $e[u] \leftarrow e[u] - d_f(u, v)$
- 7 $e[v] \leftarrow e[v] + d_f(u, v)$



Definitions

- The operation $PUSH(u, v)$ is called a push from u to v .
- When we operate $PUSH(u, v)$ and $c_f(u, v) = 0$ afterwards, we call edge (u, v) a saturated edge and the push from u to v a saturated push.
- Otherwise, it is an unsaturated push.

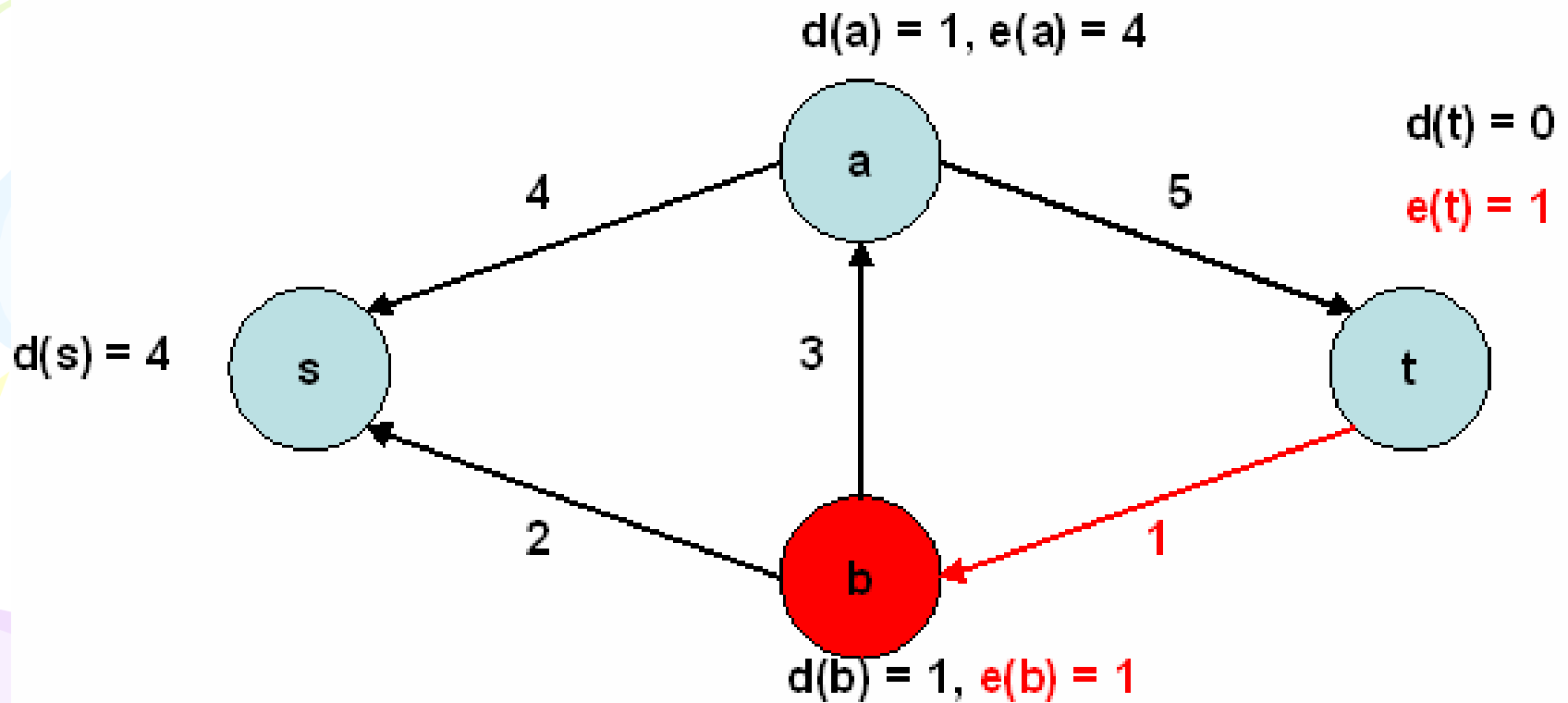


Basic Operation: Lift

If u is overflowing ($e(u) > 0$) and for all $v \in V$ ($u, v \in E_f$) we cannot push any more units of flow to vertices neighbor to u , so we need to LIFT u (relabel).

As a result we have to update the height of u .

Example





Code for Lift (Relabel) operation

RELABEL(u)

- 1 ▷ **Applies when:** u is overflowing and for all $v \in V$ such that $(u, v) \in E_f$, we have $h[u] \leq h[v]$.
- 2 ▷ **Action:** Increase the height of u .
- 3 $h[u] \leftarrow 1 + \min \{h[v] : (u, v) \in E_f\}$

Generic - Preflow - Push (G)

1. Initialization

1. Set $f = 0$
2. Compute distance labels $h(i)$ for all nodes i
3. $f_{sj} = c_{sj}$ for all $(s, j) \in E$
4. Set $h(s) = n$

2. while there exists an applicable push or lift operation

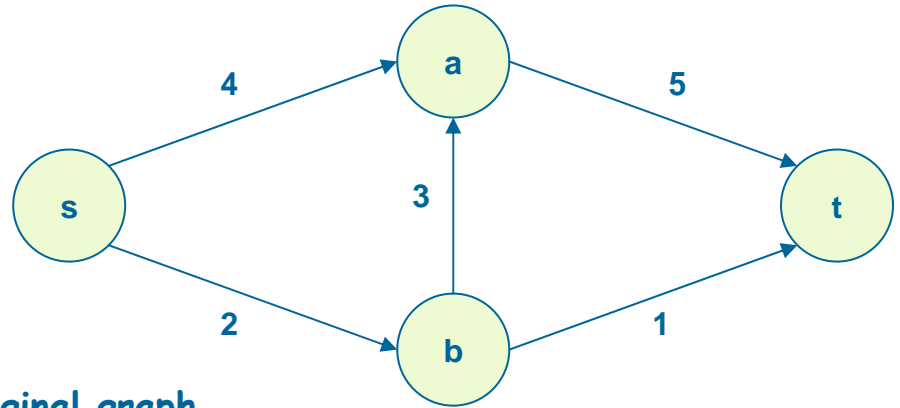
do select an applicable push or lift operation and perform it

Preflow Push example: initialize

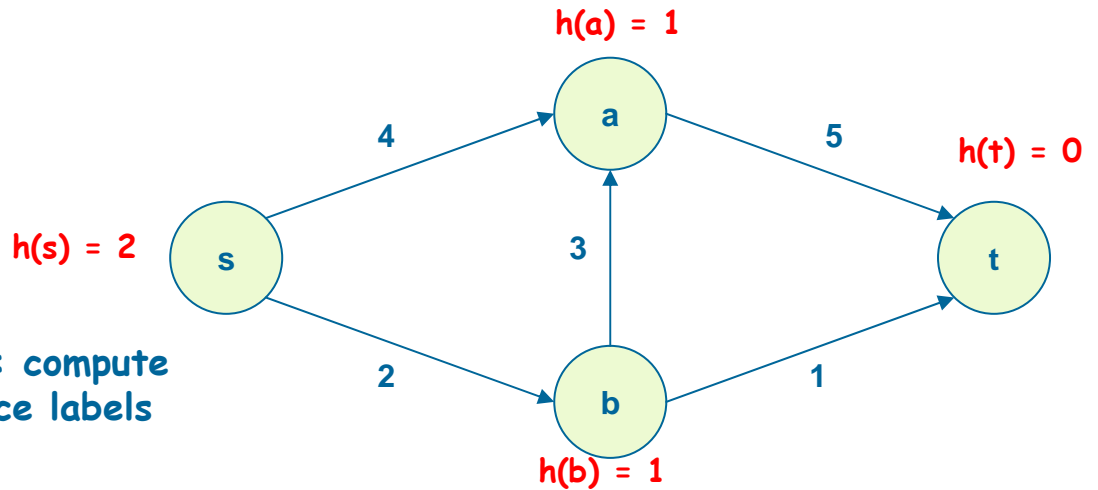
1. Initialization

1. Set $f = 0$

2. Compute distance labels $h(i)$ for all nodes i



Original graph



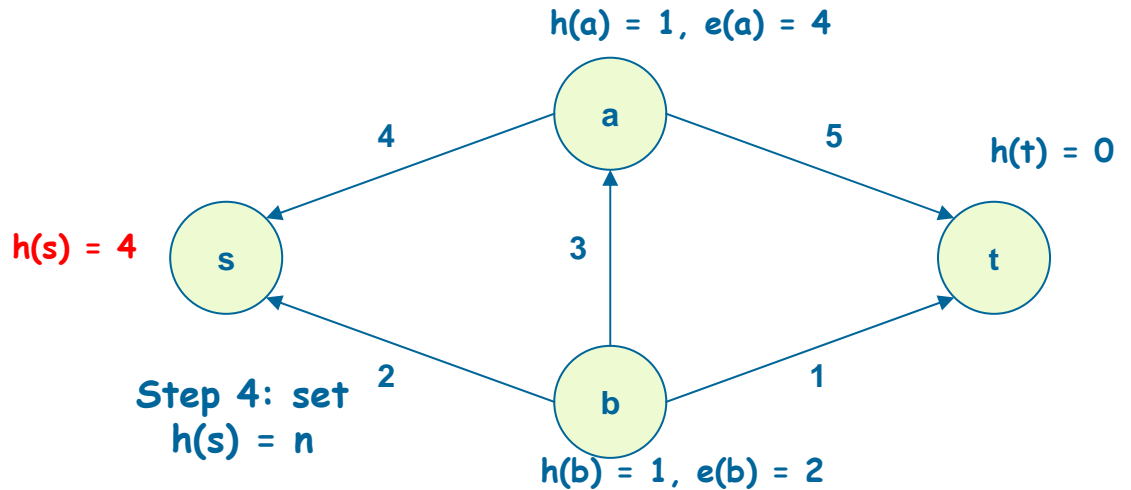
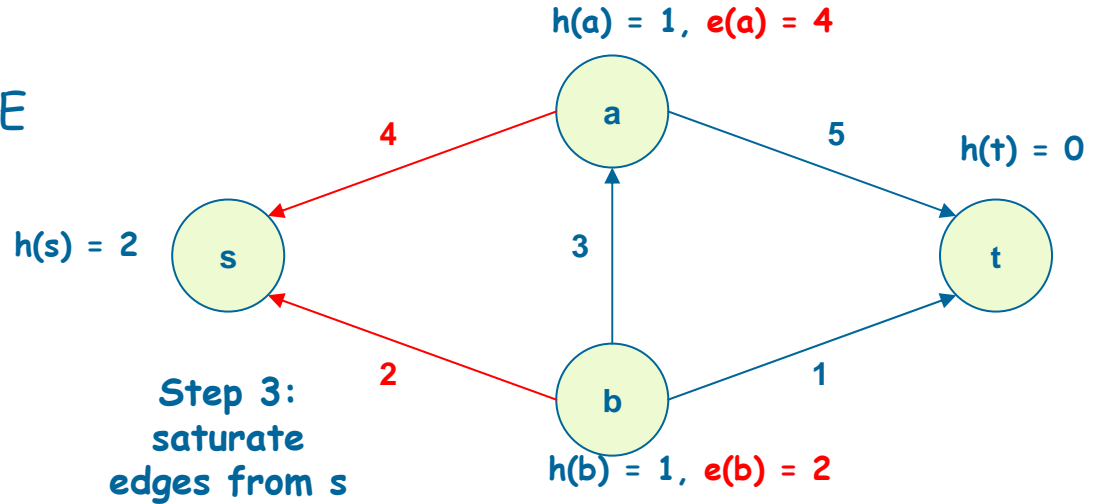
Step 2: compute
distance labels

Preflow Push example: initialize

1. Initialization

3. $f_{sj} = C_{sj}$ for all $(s, j) \in E$

4. Set $h(s) = n$



Preflow Push example: while-loop

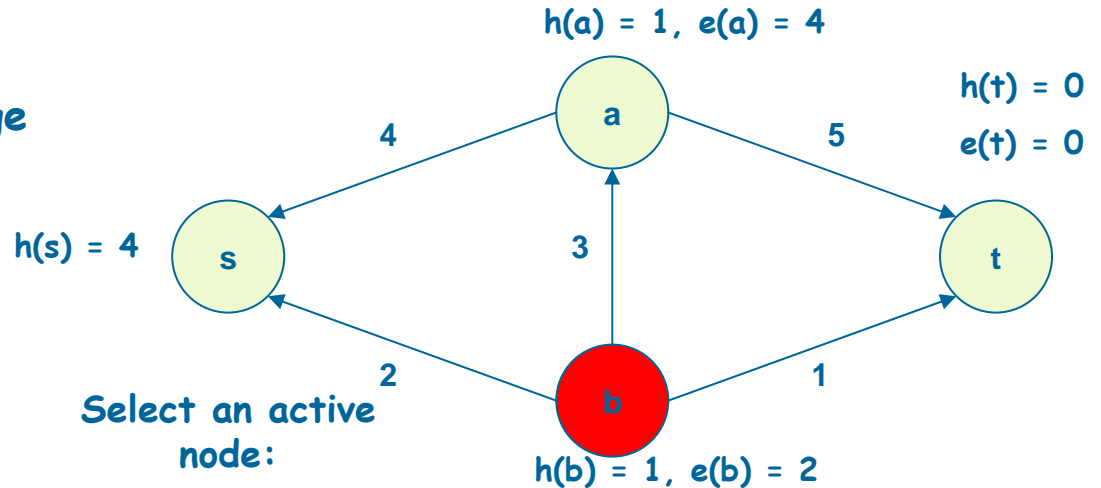
2. Push-Relabel (node i)

if there is an admissible edge (i,j)

push $\min(e(i), c_f(i,j))$ on edge (i,j)

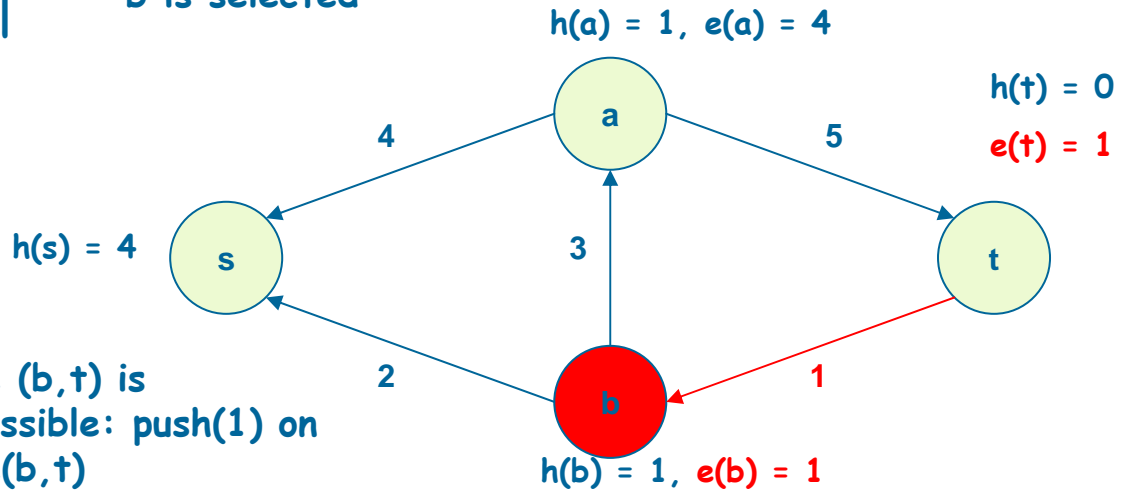
else

$h(i) = 1 + \min \{ h(j) \mid c_f(i,j) > 0 \}$



Select an active node:

b is selected



edge (b,t) is admissible: push(1) on edge(b,t)

Preflow Push example: while-loop

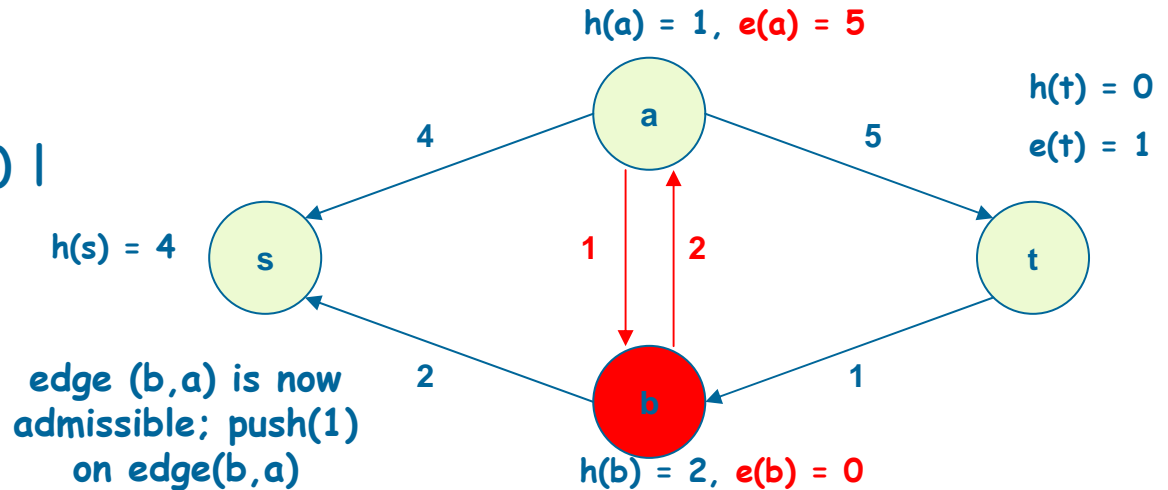
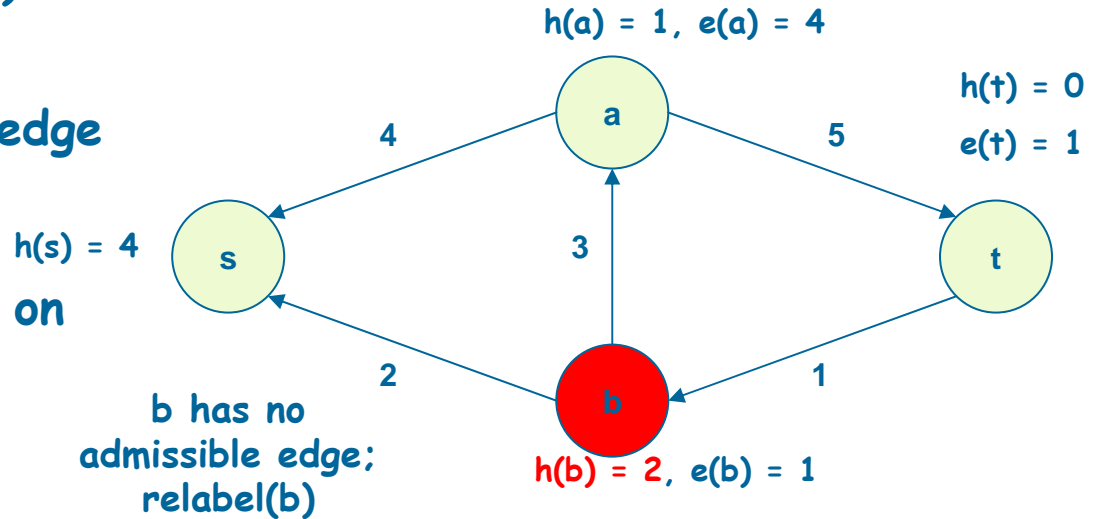
2. Push-Relabel(node i)

if there is an admissible edge
(i, j)

push $\min(e(i), c_f(i,j))$ on
edge (i,j)

else

$h(i) = 1 + \min \{ h(j) \mid c_f(i,j) > 0 \}$



Preflow Push example: while-loop

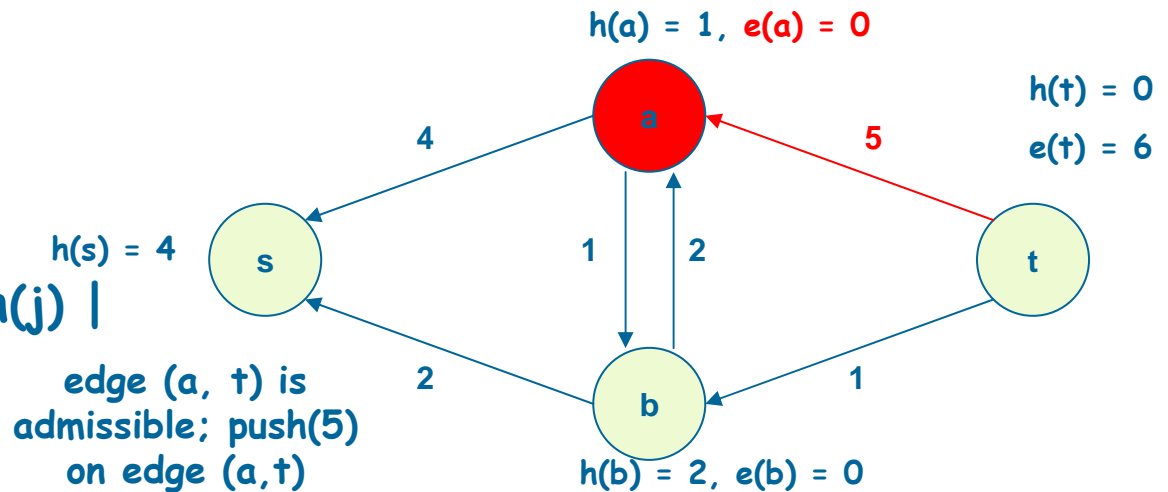
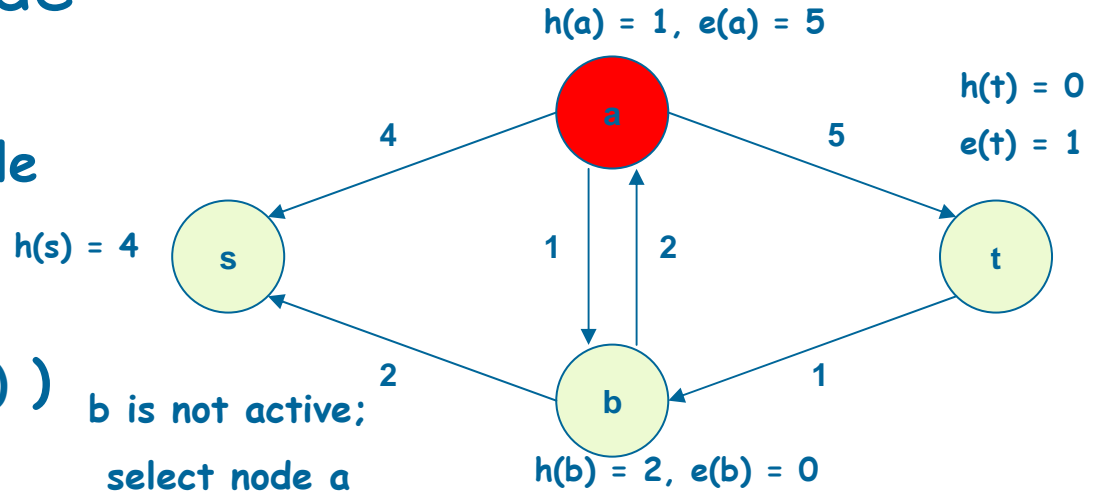
2. Push-Relabel (node i)

if there is an admissible edge (i, j)

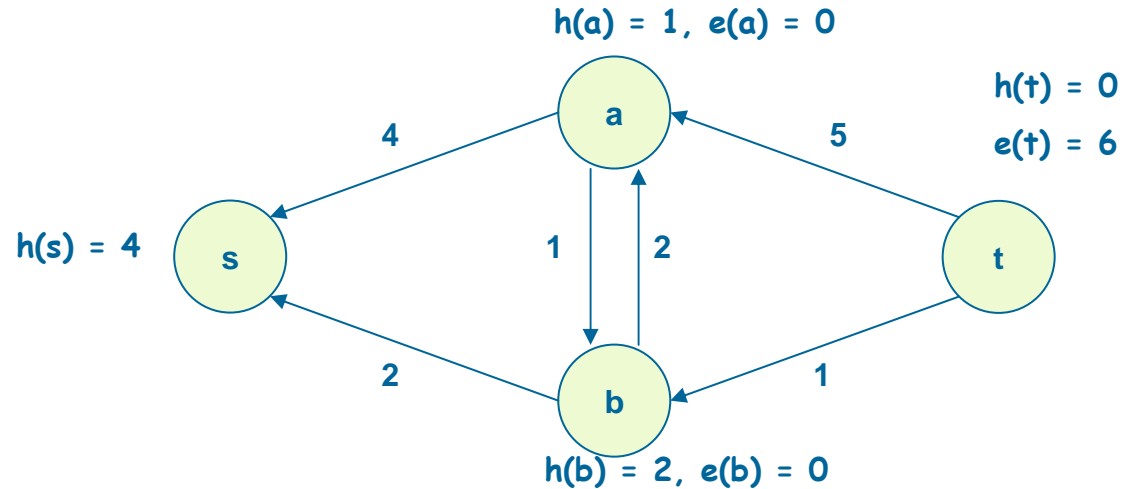
push $\min(e(i), c_f(i,j))$ on edge (i,j)

else

$h(i) = 1 + \min \{ h(j) \mid c_f(i,j) > 0 \}$



Preflow Push example: while-loop



There are no more active nodes; the algorithm drops out of the while-loop

Correctness

- During the execution of the Preflow Push algorithm, height $h(u)$ never decreases. Moreover whenever a lift operation is applied to u , $h(u)$ increases.
- During the execution of the Preflow Push algorithm, the attribute h is maintained as a height function.
 - Induction to the number of basic operations performed: Initially OK.
After Lift(u): For nodes v : $(u, v) \in E_f$ OK. For nodes w : $(w, u) \in E_f$, before Lift $h(w) \leq h(u) + 1 \rightarrow h(w) < h(u) + 1$ afterwards.After Push(u, v): Edge (u, v) is either added to E_f ($h(v) = h(u) - 1$) or (u, v) is removed from E_f (the constraint is removed).

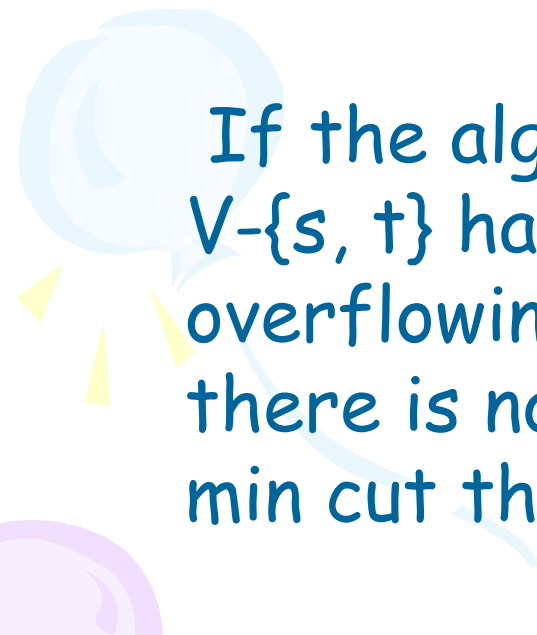
Correctness

- When the algorithm terminates, there is no path from s to t in the residual graph.
 - Assume a path u_0, u_1, \dots, u_k from s to t with k edges. The minimum distance between two edges must be at least 1 and wlog the path is simple, so $k < |V|$. h is a height function, so $h(u_i) \leq h(u_{i+1}) + 1$ for $i=0, \dots, k-1$
Combining the inequalities we obtain $h(s) \leq h(t) + k$. However $h(t) = 0$, so $h(s) \leq k < |V|$, contradiction.



Correctness

- If the algorithm terminates then the preflow f is maximum flow for G .



If the algorithm terminates each vertex in $V - \{s, t\}$ has 0 excess, so there are no overflowing vertices. h is a height function, there is no path from s to t and by max flow min cut theorem f is a maximum flow.



Termination: Bound the operations it performs

- Lift operations: $(2|V|-1)(|V|-2) < 2|V|^2$
- Saturated pushes: $2|V||E|$
- Unsaturated pushes: $2|V|^2(|V|+|E|)$
- Generic Preflow push algorithm: $O(V^2E)$

The slide features a decorative background on the left side with three balloons in light green, light blue, and light purple, along with yellow streamers and triangular flags.

Lift - to - front algorithm

- By choosing carefully the order of the operations and managing the data structure carefully we can solve the maximum flow problem faster.
- Lift - to - front algorithm: list of vertices, list of neighbors to a vertex, discharging vertices (perform all allowed push and lift operations).



Discharge(u)

DISCHARGE(u)

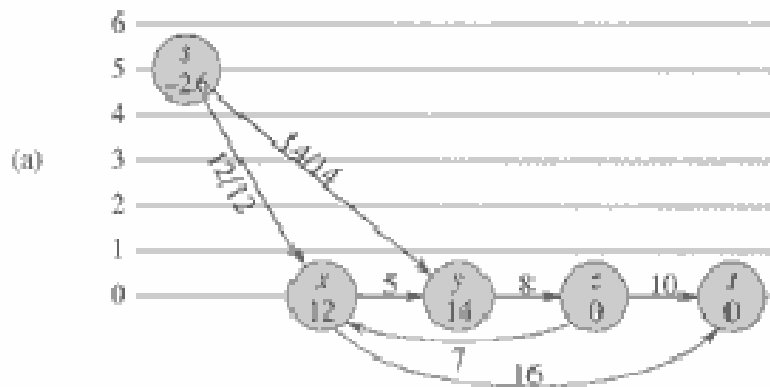
```
1  while  $e[u] > 0$ 
2      do  $v \leftarrow \text{current}[u]$ 
3          if  $v = \text{NIL}$ 
4              then RELABEL( $u$ )
5                   $\text{current}[u] \leftarrow \text{head}[N[u]]$ 
6          elseif  $c_f(u, v) > 0$  and  $h[u] = h[v] + 1$ 
7              then PUSH( $u, v$ )
8          else  $\text{current}[u] \leftarrow \text{next-neighbor}[v]$ 
```


Lift – to – front algorithm

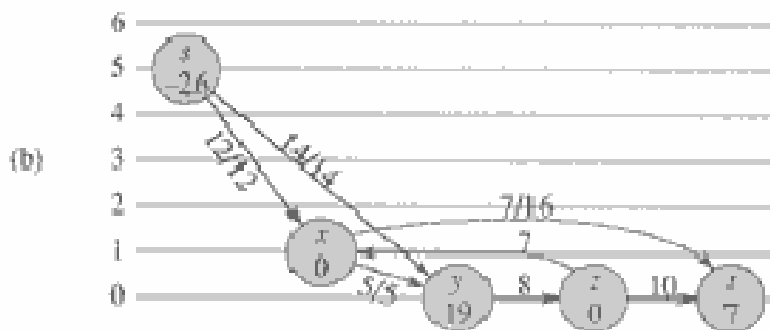
RELABEL-TO-FRONT(G, s, t)

- 1 INITIALIZE-PREFLOW(G, s)
- 2 $L \leftarrow V[G] - \{s, t\}$, in any order
- 3 **for** each vertex $u \in V[G] - \{s, t\}$
- 4 **do** $current[u] \leftarrow head[N[u]]$
- 5 $u \leftarrow head[L]$
- 6 **while** $u \neq \text{NIL}$
- 7 **do** $old\text{-}height \leftarrow h[u]$
- 8 DISCHARGE(u)
- 9 **if** $h[u] > old\text{-}height$
- 10 **then** move u to the front of list L
- 11 $u \leftarrow next[u]$

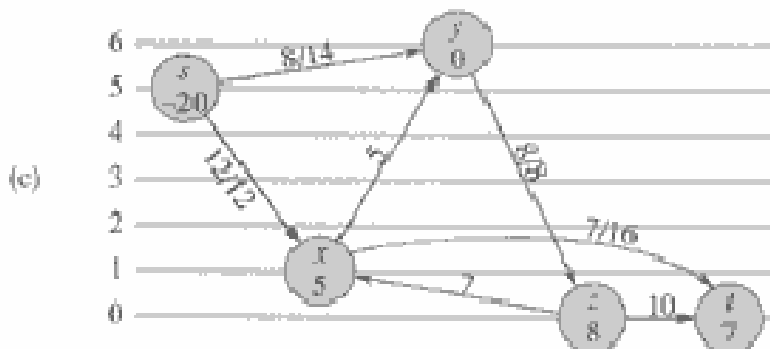
Example



$L:$	x	y	z
$N:$	x	x	x
	y	x	y
	z	z	t
			t

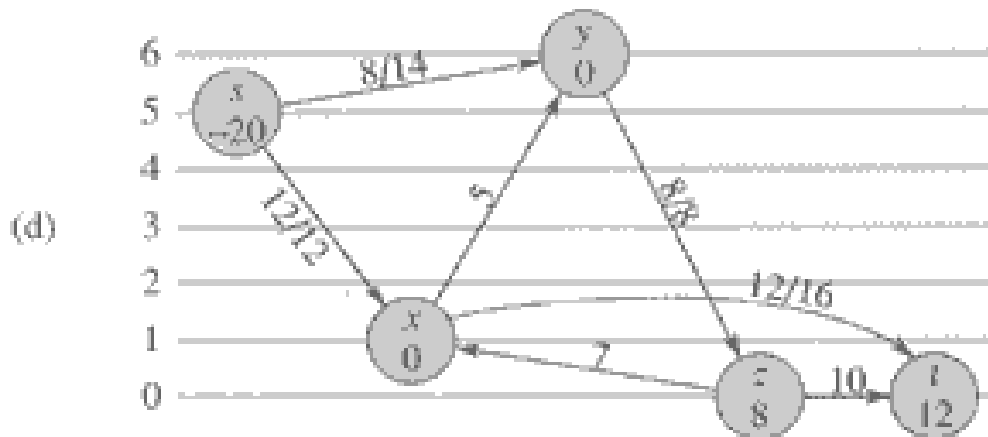


$L:$	x	y	z
$N:$	s	s	s
	y	x	y
	z	z	t
	t		

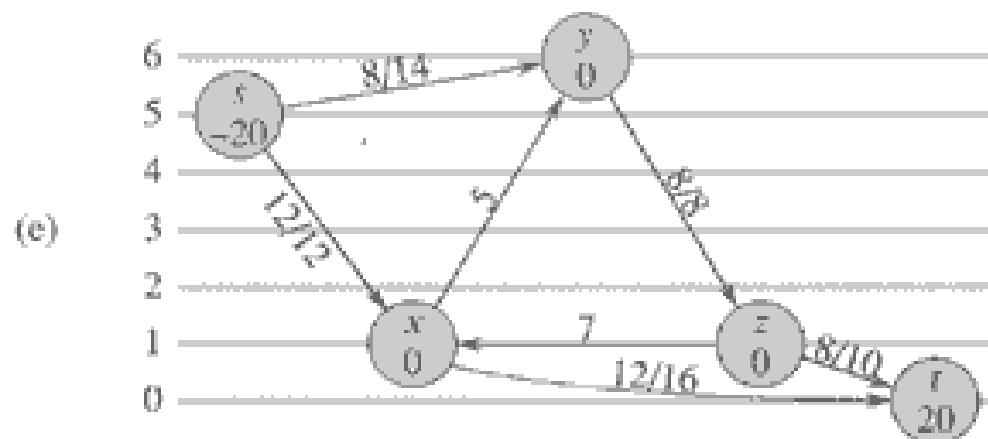


$L:$	y	x	z
$N:$	s	s	x
	x	y	y
	z	z	t
			t

Example



$L:$	y	x	z
$N:$	s	s	x
	x	y	y
	z	z	t
		t	



$L:$	z	y	x
$N:$	x	s	s
	y	x	y
	t	z	z
			t

Running time of Lift - to - front algorithm: $O(V^3)$

- There are $O(V^2)$ phases (because of the $O(V^2)$ lift operations). Each phase has at most $|V|$ calls of the Discharge operation. If Discharge does not perform a lift operation, the length of the list L is less than $|V|$. If it does, the next call of Discharge is in the next phase. So the while loop performs at most $O(V^3)$ operations.
- Discharge:
 - Lift operations: $O(V^2)$
 - $\text{current}(u)$ update: $O(VE)$
 - Push operation: $O(VE)$ saturating pushes, $O(V^3)$ unsaturating pushes