

CSC 226

Algorithms and Data Structures: II

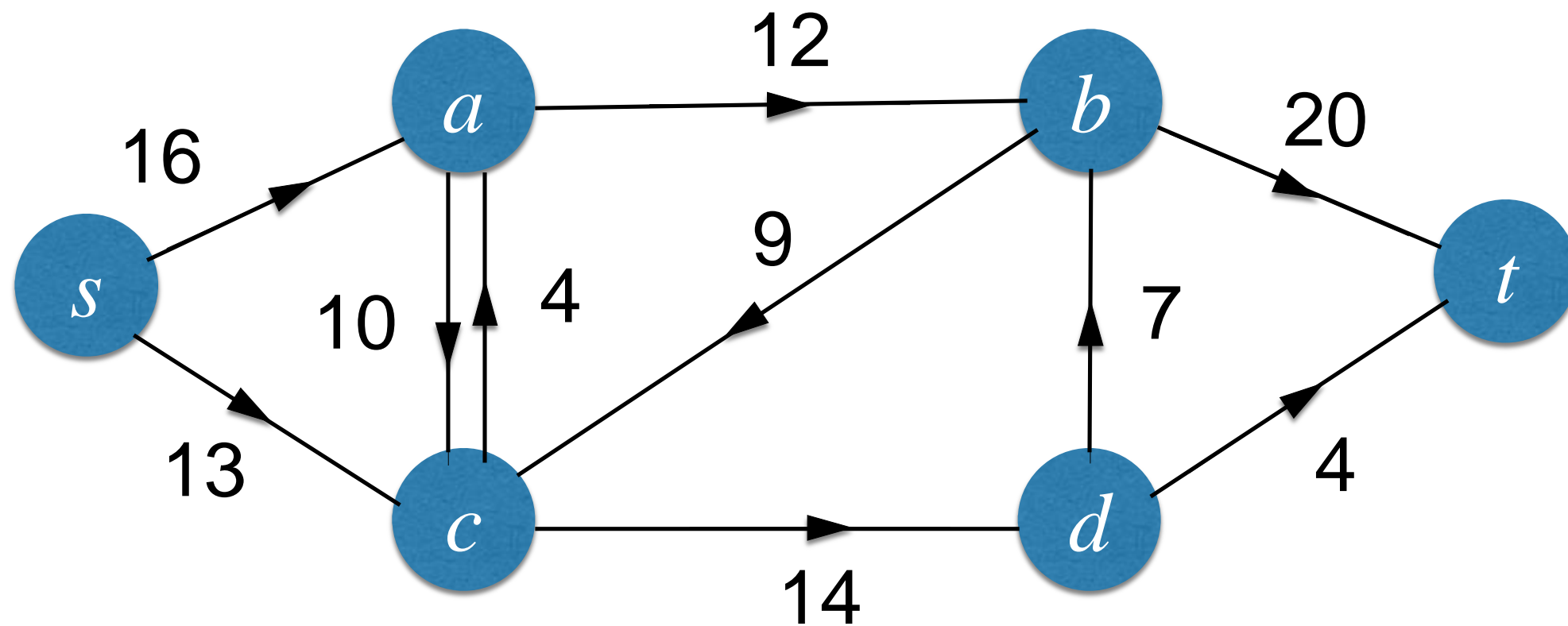
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ECS 516

Network Flow

Example of an st -flow network



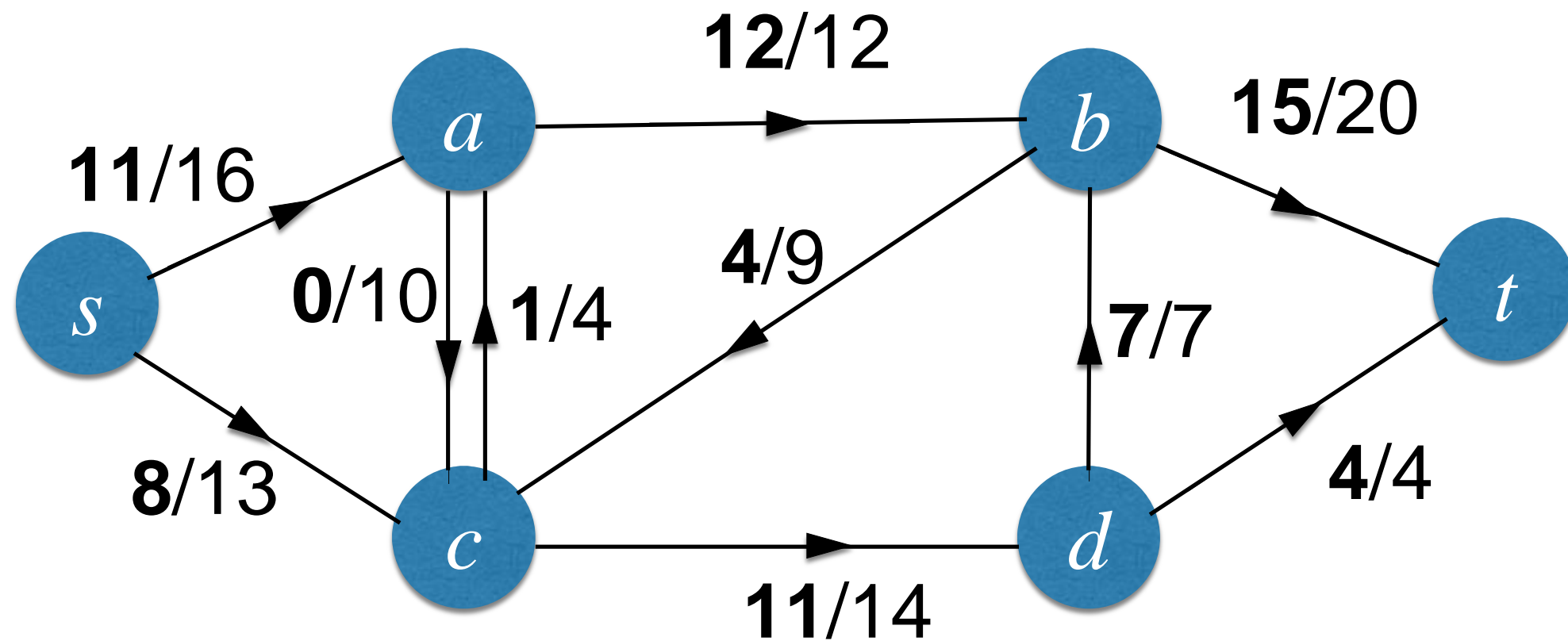
Network Flow (Definitions)

- A **flow network** is an edge-weighted, directed graph with positive edge weights, called **capacities** (capacities of non-existing edges are zero)
- An **st -flow network** is a flow network that has two identified vertices, namely the **source** s and the **sink** t
- An **st -flow** in an st -flow network is a set of nonnegative values (*edge flows*) associated with each edge. Furthermore, we define
 - **inflow**: total flow of edges into a specific vertex
 - **outflow**: total flow of edges from a specific vertex
 - **netflow**: inflow minus outflow of a specific vertex

Flow Network (Definitions)

- An st -flow is *feasible* if it satisfies the conditions that
 - no edge's flow is greater than that edge's capacity and
 - the netflow of every vertex v (except s and t) in the st -flow network is zero: $inflow(v) = outflow(v)$
- st -flow **value** $|f|$ for st -flow network N with st -flow f : the sink's inflow (or the source's outflow)
- **Maximum** st -flow (or **maxflow**): a feasible st -flow with maximum st -flow value over all feasible flows

Example of a feasible st -flow in an st -flow network



Maximum Flow Problem:

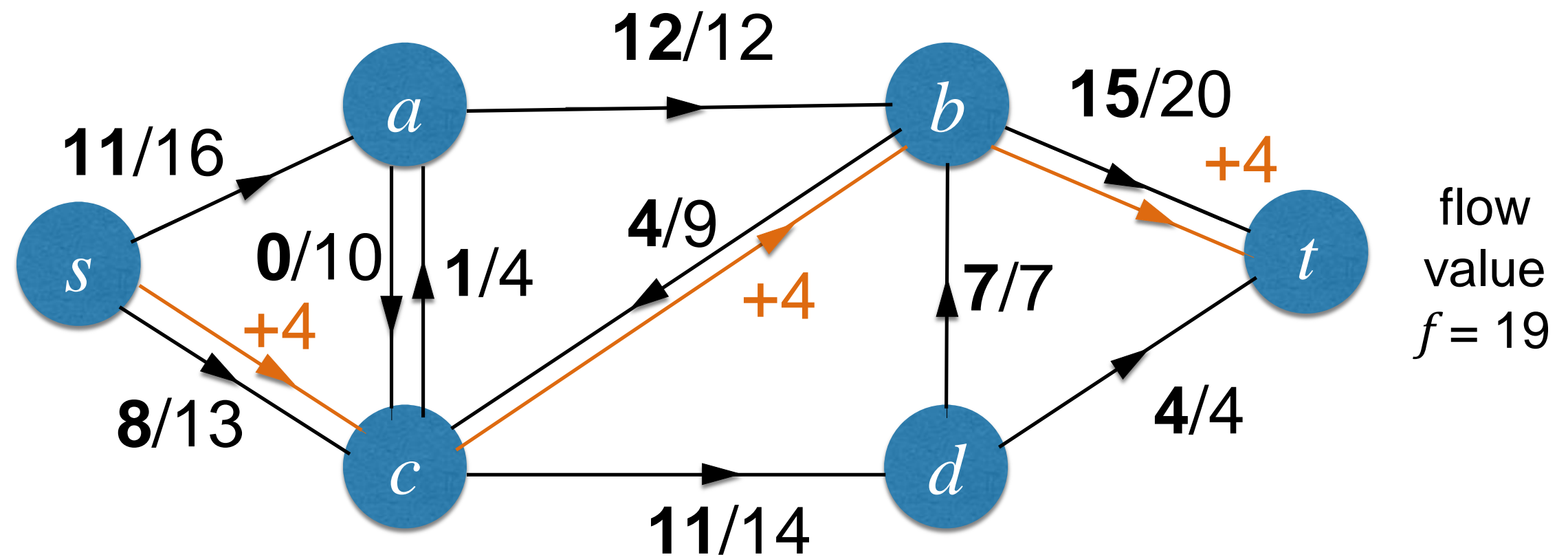
maxflow

- Input: An st -flow network
- Output: A maximum st -flow

Key idea: Augmenting paths in st -flow networks

- An *augmenting path* in an st -flow network with feasible st -flow is an undirected path from source s to sink t along which we can push more flow, obtaining an st -flow with higher st -flow value.

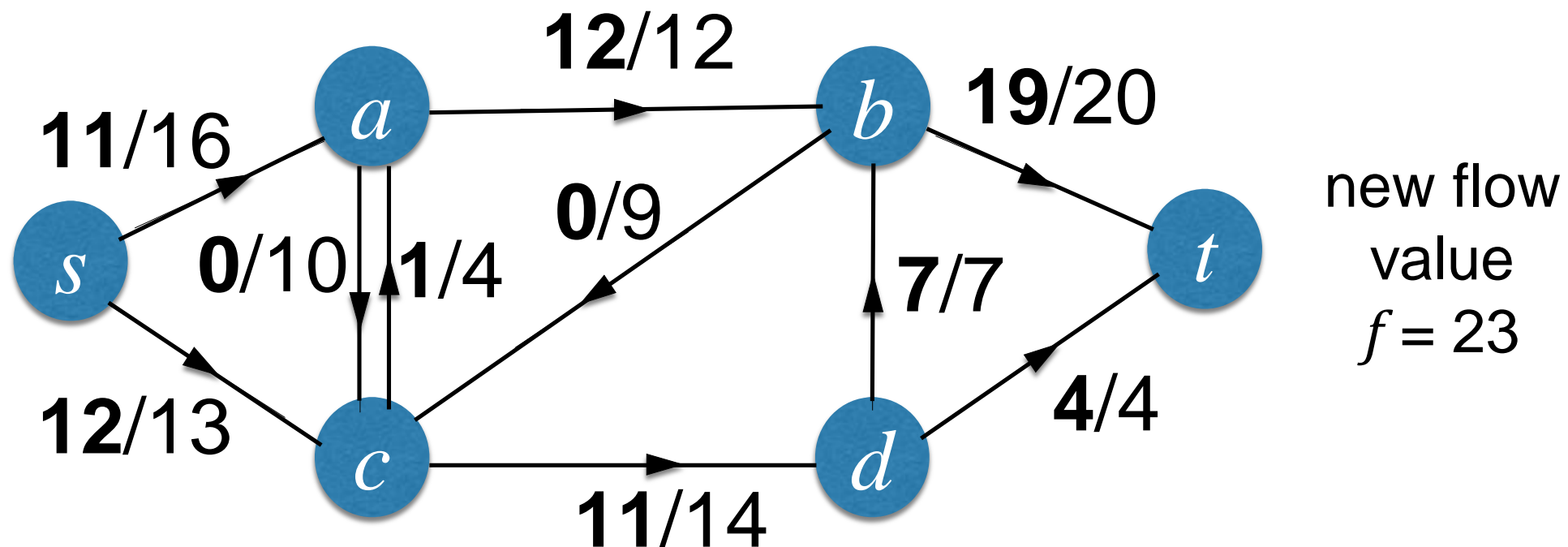
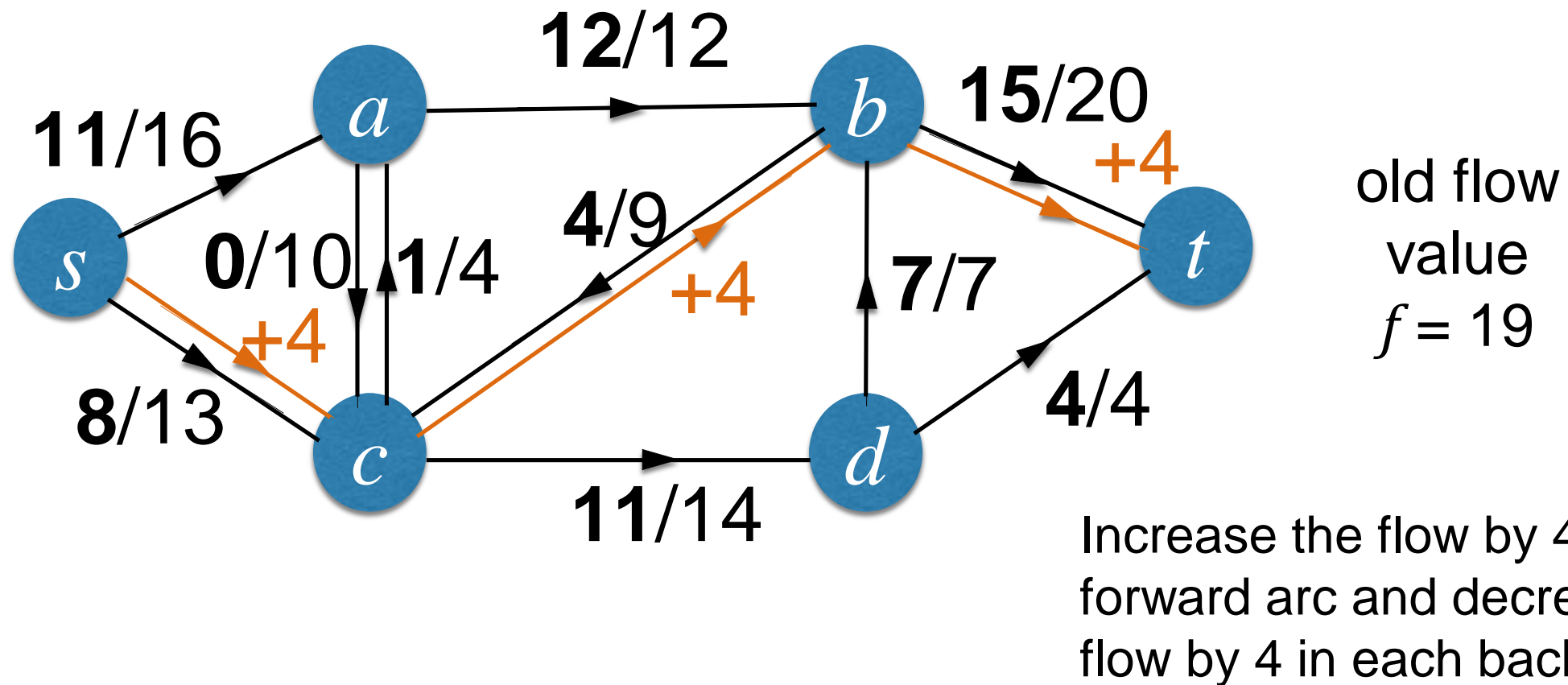
Example of an augmenting path that improves the flow: *scbt*



Arc bc is a *backward* arc on the path $scbt$.

$$\text{bottleneck capacity} = \min\{(13-8), 4, (20-15)\} = +4$$

Improved flow: can increase by +4



Ford-Fulkerson's maxflow method

1. Initialize with a 0 flow: st -flow value $f = 0$
2. Increase the flow along any augmenting path from s to t
3. Repeat step 2 as long as an augmenting path exists

Finding Augmenting Paths: the residual network G_f of a flow f

- Consider an st -flow f in st -flow network G and a directed edge (u,v) in G
- The amount of additional flow we can push from u to v along (u,v) in G is called the *residual capacity* $c_f(u,v)$ of edge (u,v) -- it depends on f .
- That is: for edge (u,v) with capacity $c(u,v)$ and flow value $f(u,v)$ from u to v we have the residual capacity $c_f(u,v) = c(u,v) - f(u,v)$; this creates a directed edge (u,v) in the residual network G_f with capacity $c_f(u,v)$.
- Of course in G we could instead *reduce* the flow in (u,v) by as much as $f(u,v)$; this creates a directed edge (v,u) in the residual network G_f with capacity

$$c_f(v,u) = f(u,v). \quad (\text{Note the order of the vertices.})$$

Residual Network

- Given an st -flow network $G = (V, E)$ and a flow f , the *residual network* of G induced by f is $G_f = (V, E_f)$ where $E_f = \{(u, v) \in V \times V : c_f(u, v) > 0\}$

Question:

Consider an edge (u,v) in G . How many edges does (u,v) create in the residual network G_f ?

- A. 1 edge: (u,v)
- B. 2 edges: (u,v) and (v,u)
- C. Can't tell – it depends on the flow f , which can change

Question:

Consider an edge (u,v) in G , where
capacity $c(u,v) = 5$

and

flow $f(u,v) = 5$.

How many edges does (u,v) create in the
residual network G_f ?

- A. 0
- B. 1
- C. 2

Question:

Consider an edge (u,v) in G , where
capacity $c(u,v) = 5$

and

flow $f(u,v) = 3$.

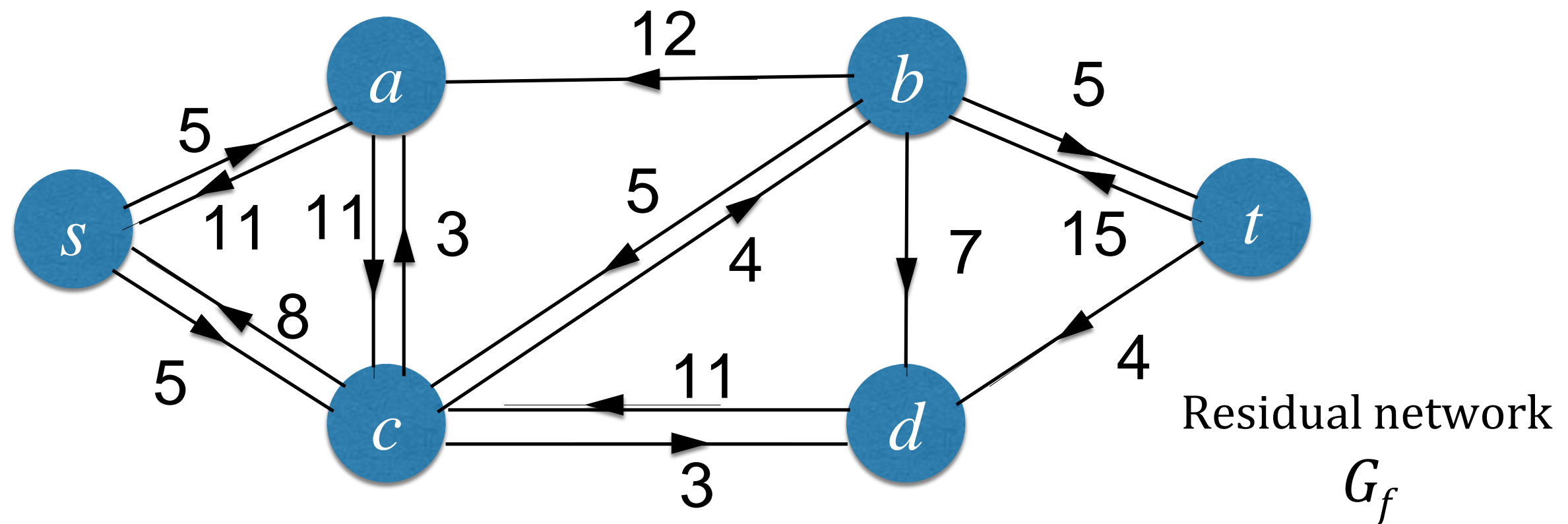
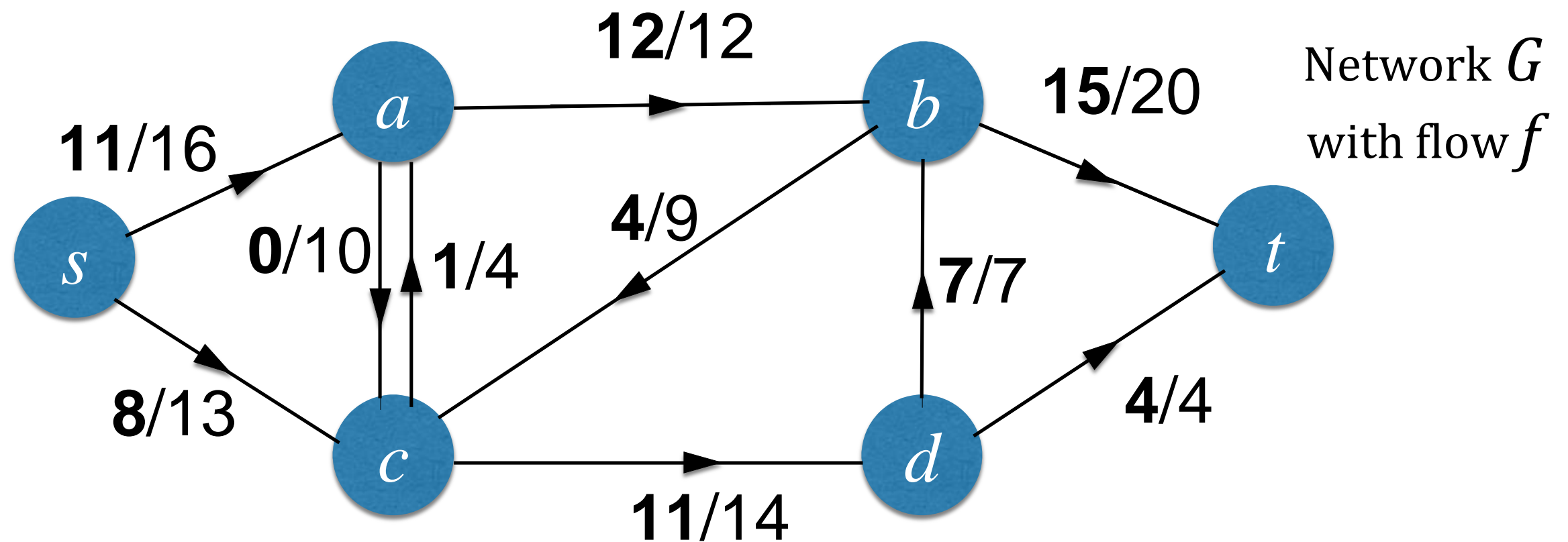
How many edges does (u,v) create in the
residual network G_f ?

A. 0

B. 1

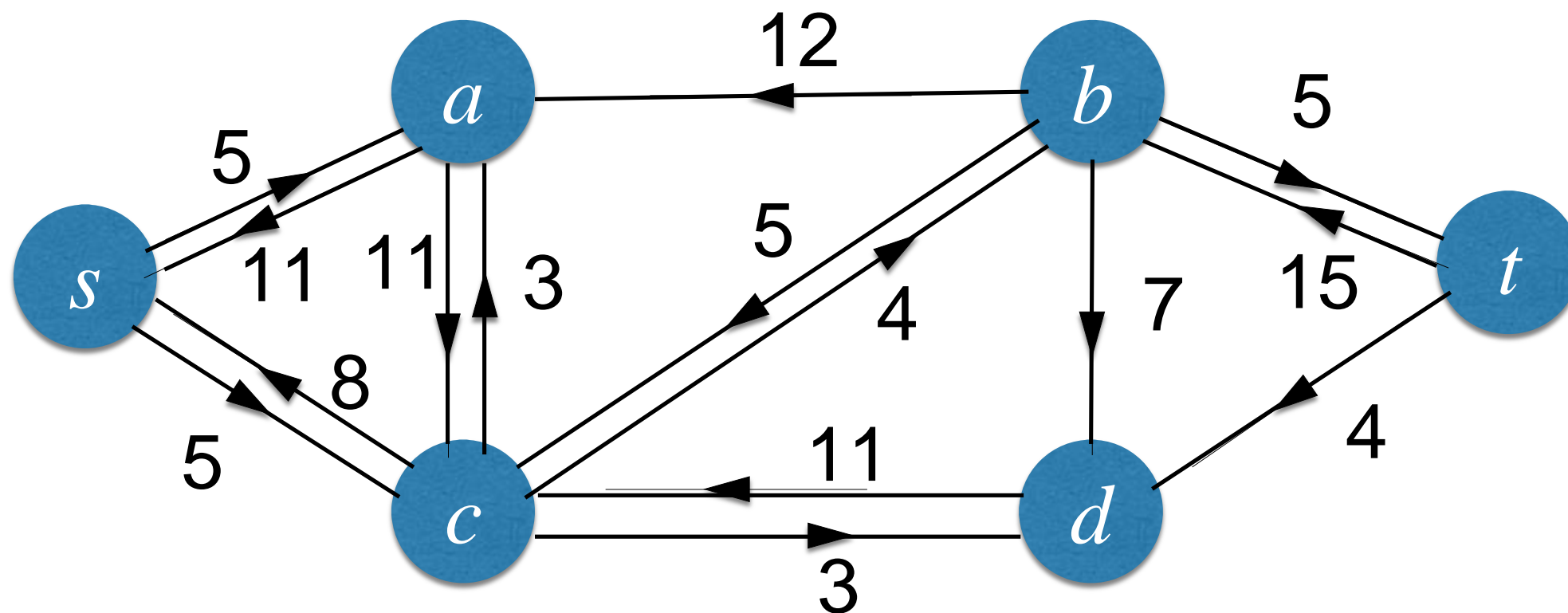
C. 2

Example of a residual network



Augmenting path from s to t in residual network G_f :
 $scbt$

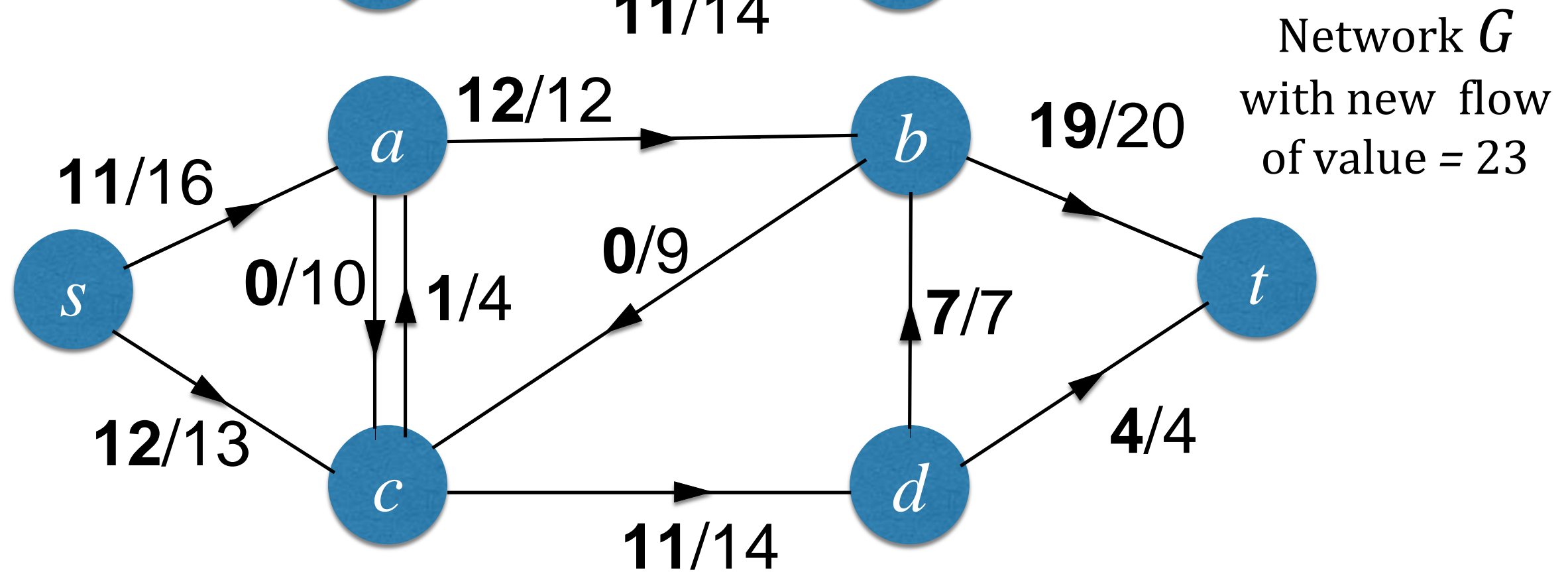
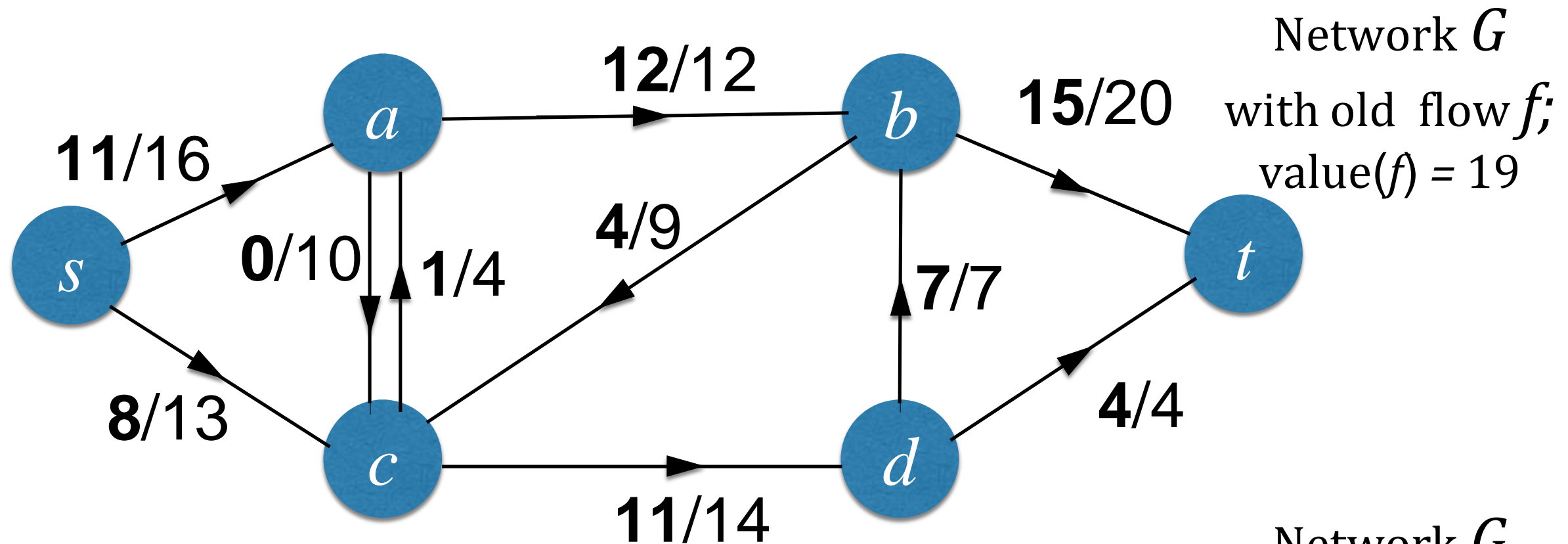
Residual network
 G_f



Residual capacity of path $scbt$ is $\min\{5, 4, 5\} = 4$

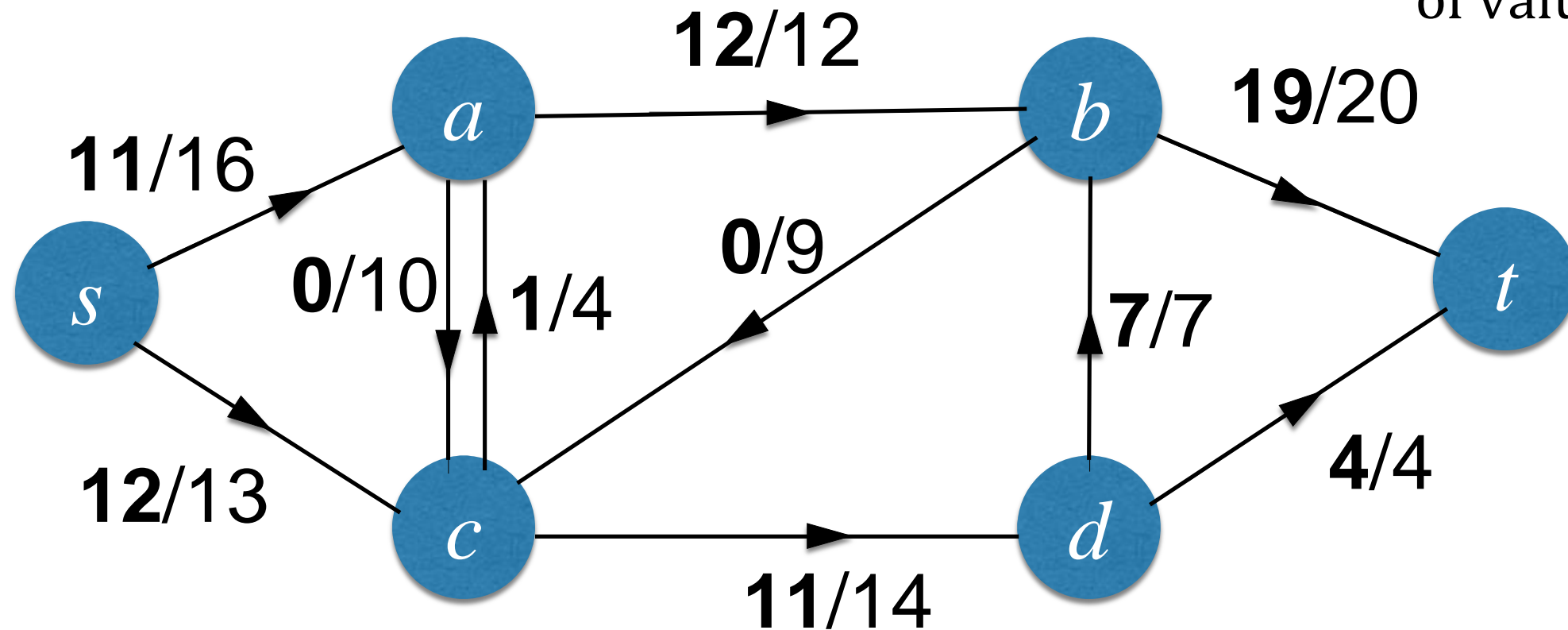
In G , increase flow in each forward arc by 4, decrease flow in each backward arc by 4 to get new flow

Augment the flow along path $scbt$ by 4



Claim: the new flow is a maxflow.

Network G
with new flow
of value = 23



How would you prove this claim?
(two ways)

st -cuts

- Recall: A *cut* in a (directed) graph is a partition of the vertices into two disjoint subsets.
- The *cut edges* of a graph with a cut are the edges that have one endpoint in each subset of the partition.
- An *st -cut* is a cut that places vertex s in one of its subsets and vertex t in the other.

st -cuts (continued)

- *Capacity* of an st -cut in an st -network: sum of the capacities of the cut's edges from the subset containing s to the subset containing t
- *Flow across* an st -cut in an st -network: difference between the sum of the flows of cut's edges from the subset containing s to the subset containing t and the sum of the flows of cut's edges from the subset containing t to the subset containing s

minimum st -cut problem (or *mincut* problem)

- Given an st -network, find an st -cut such that the capacity of no other cut is smaller.

Properties of feasible st -flows in st -flow networks

1. For any st -flow, the flow across each st -cut is equal to the value of the flow
2. The outflow from s is equal to the inflow to t
3. No st -flow's value can exceed the capacity of any st -cut
4. Let f be an st -flow and let (S, T) be an st -cut whose capacity equals $|f|$. Then f is a maximum flow and (S, T) is a minimum cut.

Maxflow-Mincut Theorem

- Let f be an st -flow. The following three conditions are equivalent:
 - A. there exists an st -cut whose capacity equals $|f|$
 - B. f is a maximum flow
 - C. there is no augmenting path with respect to f

Proving the flow is maximum

Compute the new residual network G_f and check it has no st -paths.

Find an S, T cut of capacity equal to the flow, 23. Such a cut provides a *certificate*, or *witness*, of optimality.

How do we find the S, T cut? Set $S = \{ v \text{ such that there is an augmenting path from } s \text{ to } v \}$ and $T = V - S$ (all the other vertices).

Ford-Fulkerson indeed computes a maximum flow

- by the Maxflow-mincut Theorem – can compute an S, T cut of capacity equal to the flow by taking

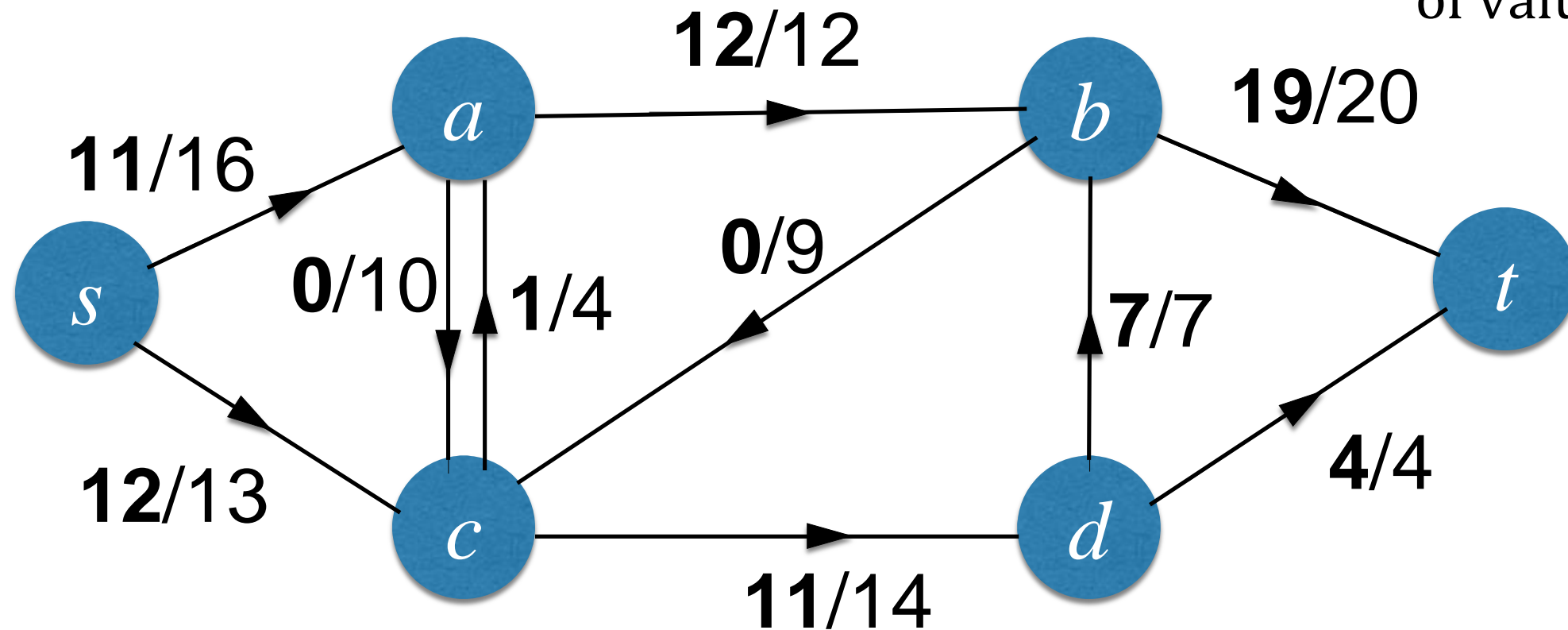
$S = \{v \text{ such that there is an augmenting path from } s \text{ to } v\}$

and

$$T = V - S$$

Claim: the new flow is a maxflow.

Network G
with new flow
of value = 23



What is the cut S, T of minimum capacity?

$S = \{ ?? \}$

$T = \{ ?? \}$

Check:

Are arcs leaving the S part full?

Are the arcs returning from the T part to S part empty?

Properties of the residual network G_f

- $|E_f| \leq 2|E|$
- The residual network G_f with capacities c_f of st -flow network G is an st -flow network

Definition of Augmenting Path

Given an st -flow f in st -flow network $G = (V, E)$ an augmenting path p is a directed path from s to t in the residual network G_f .

Pseudocode for Algorithm Ford-Fulkerson(G, s, t)

Initialize f as zero-flow

Compute residual network G_f

while there exists a path p from s to t in G_f **do**

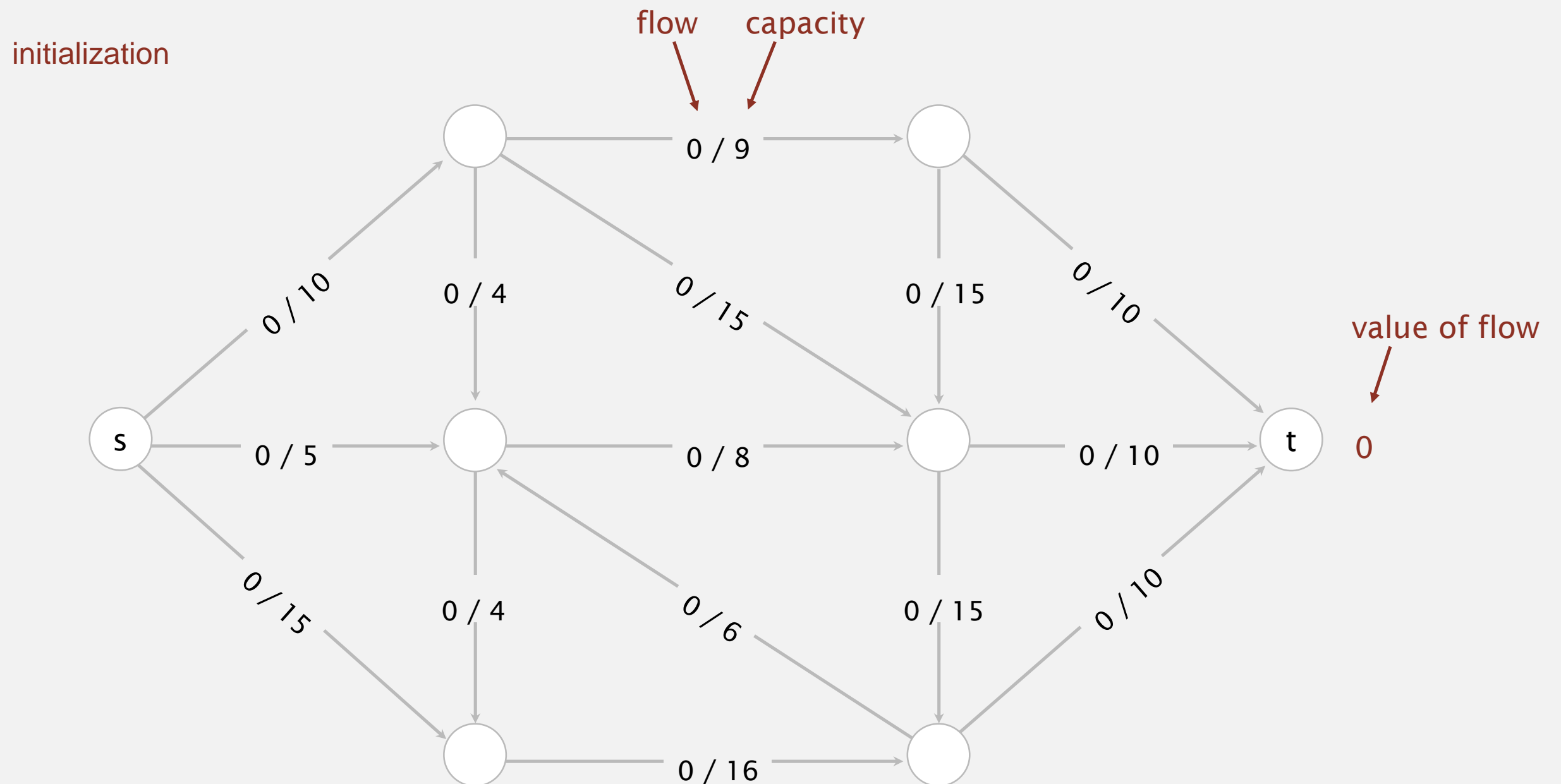
 Augment f using p

 Update G_f

return f

Ford-Fulkerson algorithm for solving MaxFlow

Initialization. Start with 0 flow.

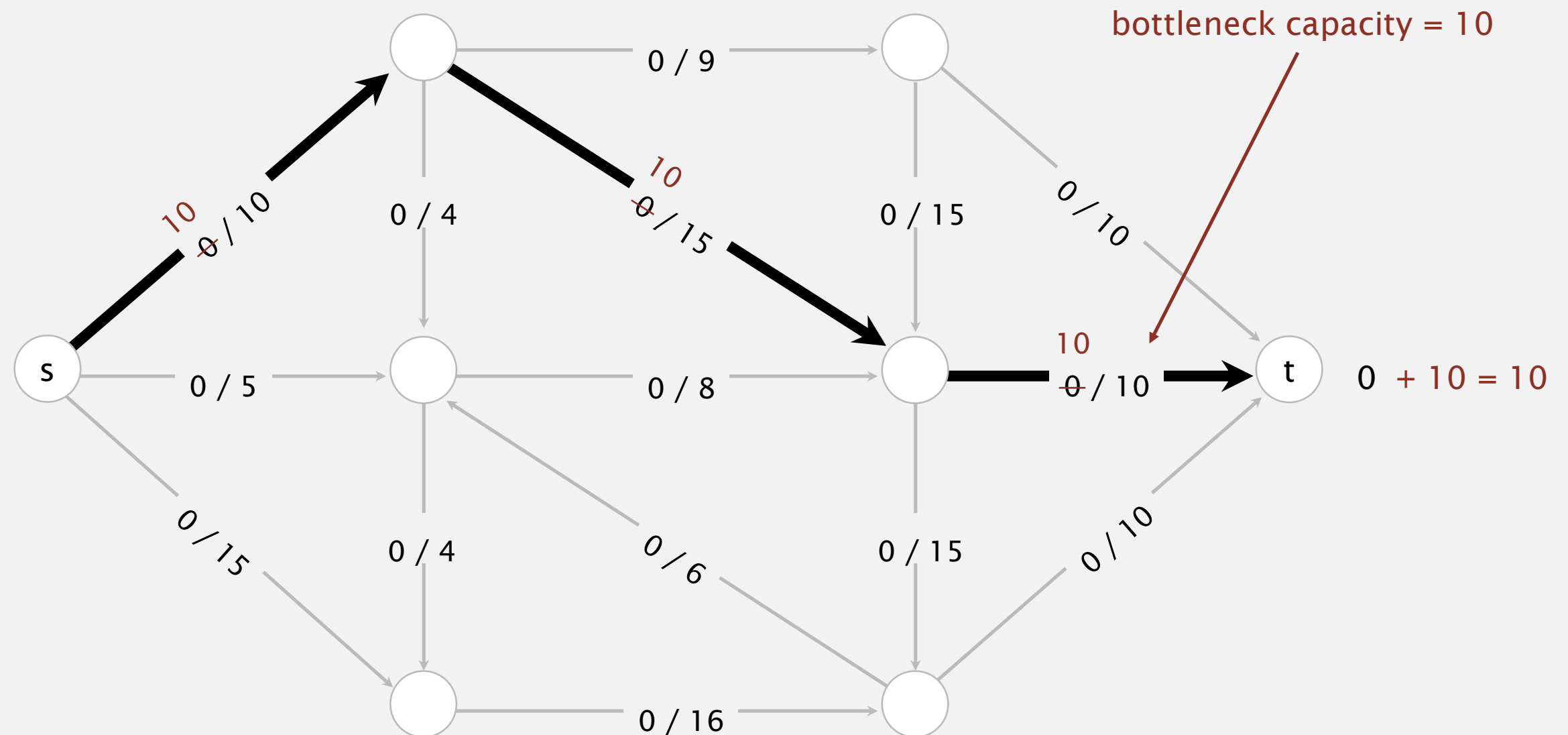


Idea: increase flow along augmenting paths

Definition: Augmenting path -- an undirected path from s to t such that:

- Can increase flow on forward edges (not full).
- Can decrease flow on backward edge (not empty).

1st augmenting path

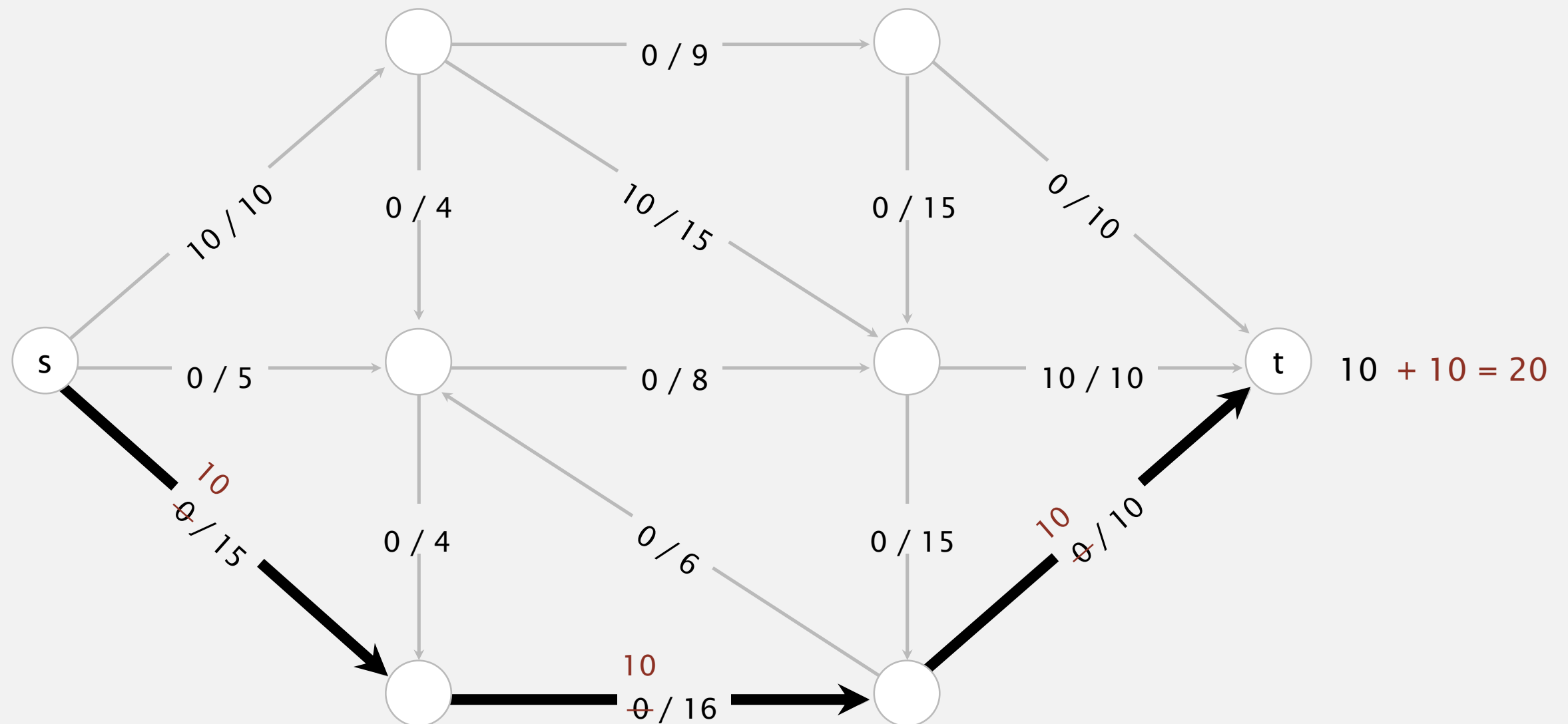


Idea: increase flow along augmenting paths

Augmenting path. Find an undirected path from s to t such that:

- Can increase flow on forward edges (not full).
- Can decrease flow on backward edge (not empty).

2nd augmenting path

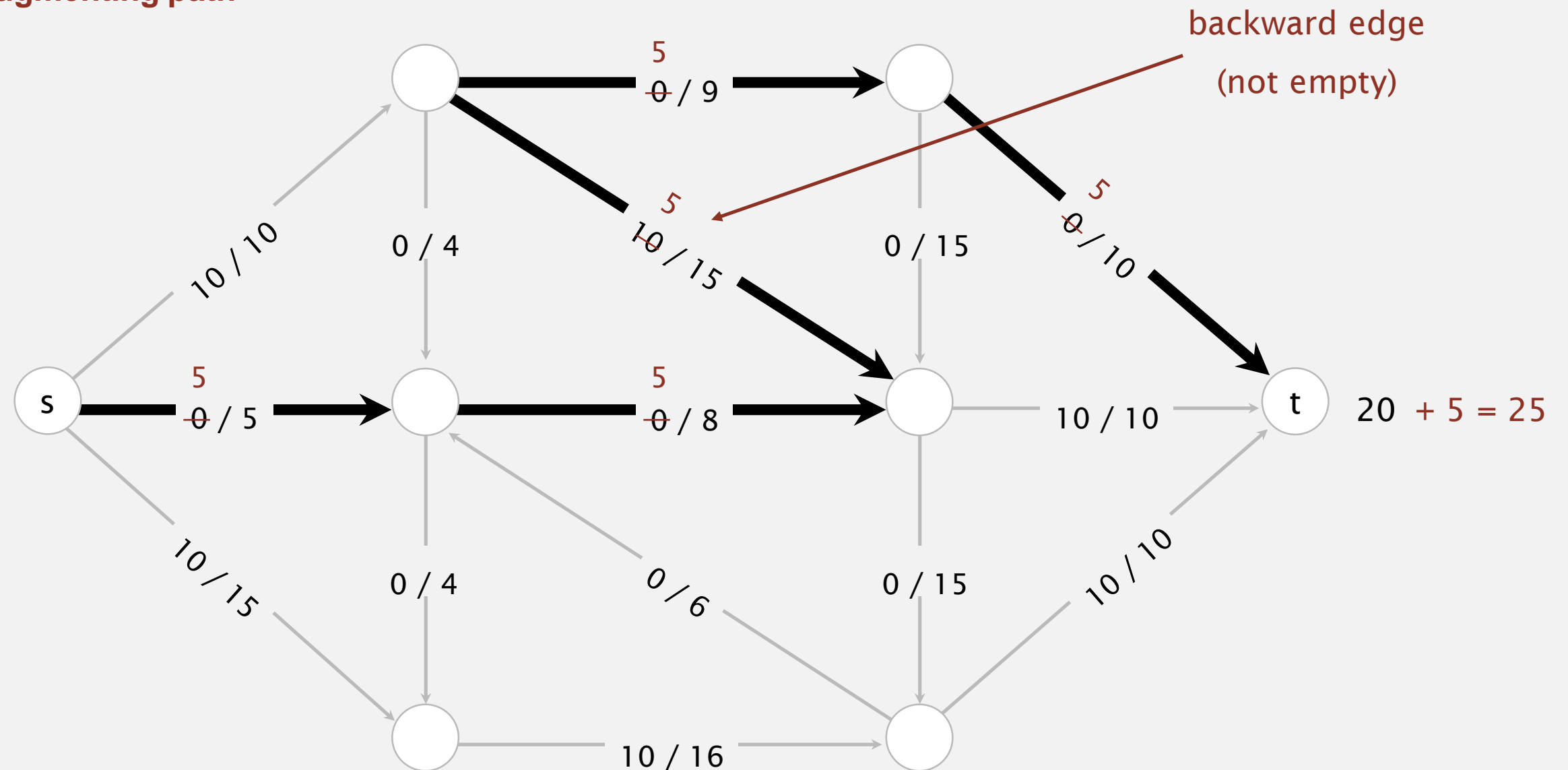


Idea: increase flow along augmenting paths

Augmenting path. Find an undirected path from s to t such that:

- Can increase flow on forward edges (not full).
- Can decrease flow on backward edge (not empty).

3rd augmenting path

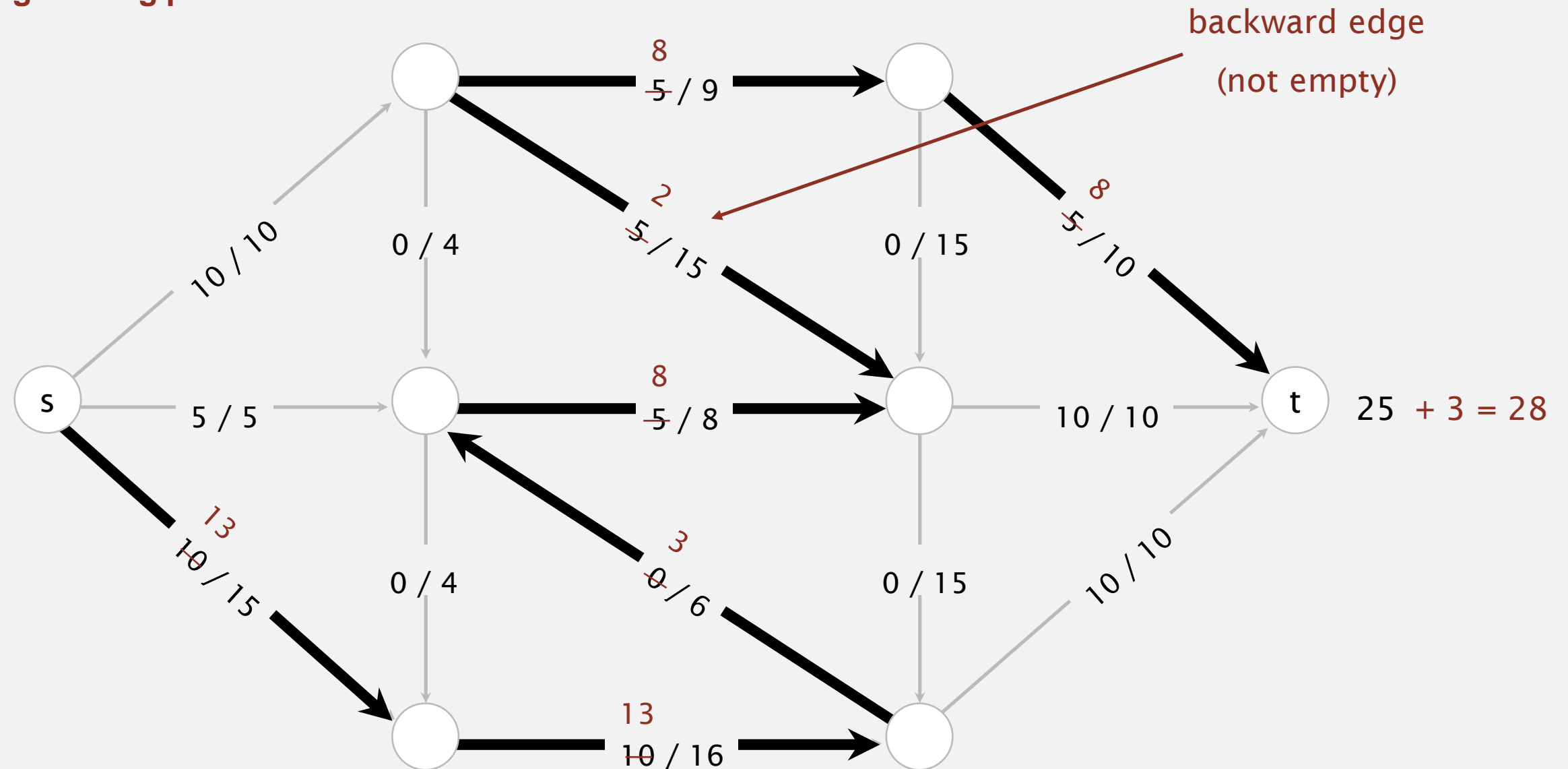


Idea: increase flow along augmenting paths

Augmenting path. Find an undirected path from s to t such that:

- Can increase flow on forward edges (not full).
- Can decrease flow on backward edge (not empty).

4th augmenting path

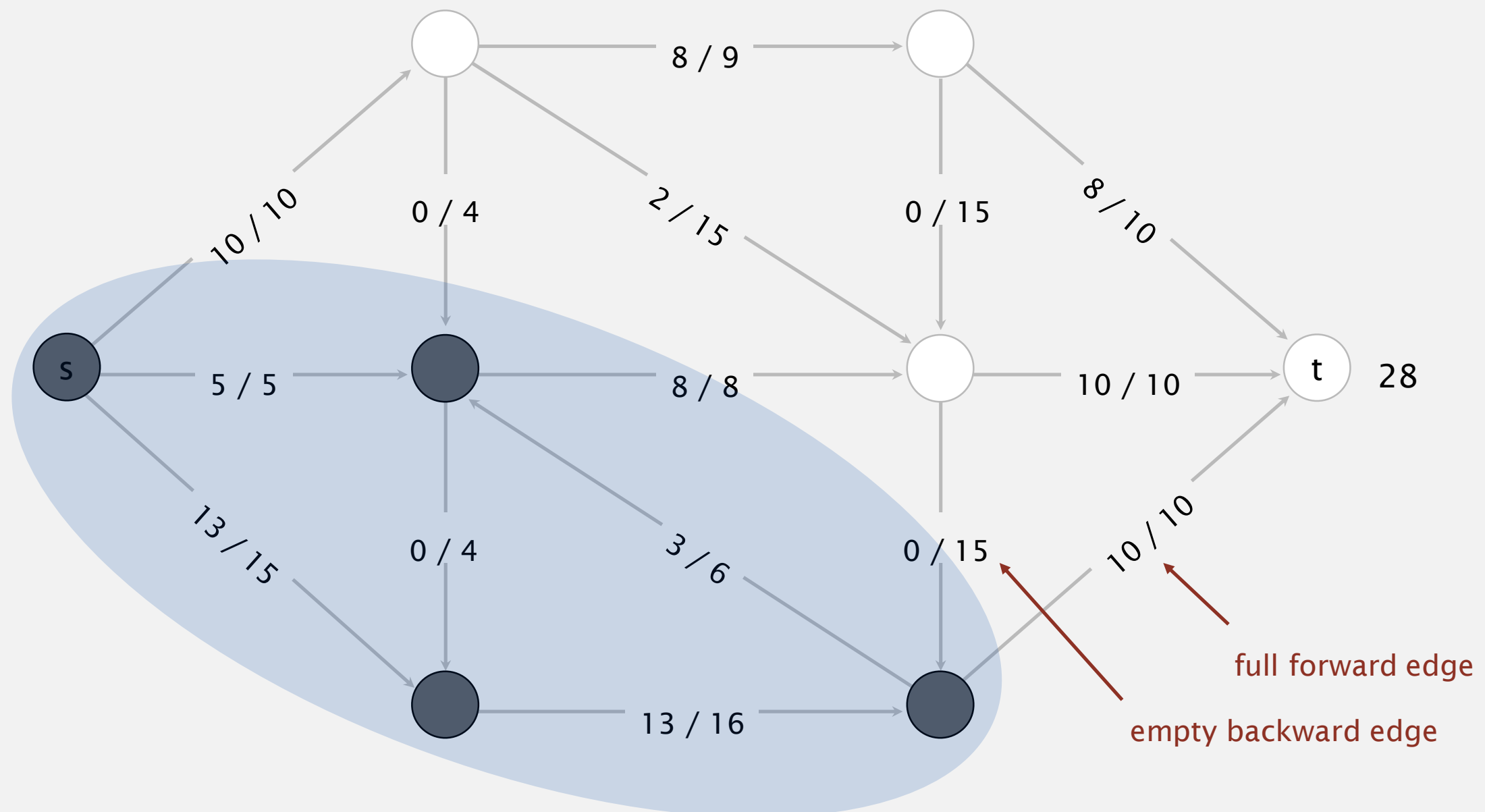


Idea: increase flow along augmenting paths

Termination. All paths from s to t are blocked by either a

- Full forward edge.
- Empty backward edge.

no more augmenting paths



Running time of Ford-Fulkerson

- Building the residual network
- Finding an augmenting path in the residual network
- How many augmenting paths can be found in the worst case, if the capacities are positive integers?
- value of maximum flow many (no more since the augmenting path has at least residual capacity 1)

EdmondsKarp(G, s, t)

Initialize f as zero-flow and residual network G_f with G
while there exists a path p from s to t in G_f **do**

 Let p be a shortest path from s to t in G_f

 Augment f using p

 Update G_f

return f

Running Time Analysis of Algorithm by Edmonds & Karp

- Overall running time when using BFS (breadth first search) for determining augmenting path: $O(nm^2)$ ($m = |E|$, $n = |V|$)
- An edge on an augmenting path in G_f is called a *bottleneck* if its capacity is equal to the path's residual capacity
- Fact: an edge in G_f can be a bottleneck at most $O(n)$ times
- The while loop therefore will not run more than $O(nm)$ times
- The while loop's running time is $O(m)$

Baseball elimination problem

Q. Which teams have a chance of finishing the season with the most wins?

| i | team | | wins | losses | to play | ATL | PHI | NYM | MON |
|---|--|----------|------|--------|---------|-----|-----|-----|-----|
| 0 |  | Atlanta | 83 | 71 | 8 | — | 1 | 6 | 1 |
| 1 |  | Philly | 80 | 79 | 3 | 1 | — | 0 | 2 |
| 2 |  | New York | 78 | 78 | 6 | 6 | 0 | — | 0 |
| 3 |  | Montreal | 77 | 82 | 3 | 1 | 2 | 0 | — |

Montreal is mathematically eliminated.

- Montreal finishes with ≤ 80 wins.
- Atlanta already has 83 wins.

Baseball elimination problem

Q. Which teams have a chance of finishing the season with the most wins?

| i | team | | wins | losses | to play | ATL | PHI | NYM | MON |
|---|--|----------|------|--------|---------|-----|-----|-----|-----|
| 0 |  | Atlanta | 83 | 71 | 8 | — | 1 | 6 | 1 |
| 1 |  | Philly | 80 | 79 | 3 | 1 | — | 0 | 2 |
| 2 |  | New York | 78 | 78 | 6 | 6 | 0 | — | 0 |
| 3 |  | Montreal | 77 | 82 | 3 | 1 | 2 | 0 | — |


Philadelphia is mathematically eliminated.

- Philadelphia finishes with ≤ 83 wins.
- Either New York or Atlanta will finish with ≥ 84 wins.

Observation. Answer depends not only on how many games already won and left to play, but on **whom** they're against.

Baseball elimination problem

Q. Which teams have a chance of finishing the season with the most wins?

| i | team | wins | losses | to play | NYN | BAL | BOS | TOR | DET |
|---|---|------|--------|---------|-----|-----|-----|-----|-----|
| 0 |  New York | 75 | 59 | 28 | — | 3 | 8 | 7 | 3 |
| 1 |  Baltimore | 71 | 63 | 28 | 3 | — | 2 | 7 | 4 |
| 2 |  Boston | 69 | 66 | 27 | 8 | 2 | — | 0 | 0 |
| 3 |  Toronto | 63 | 72 | 27 | 7 | 7 | 0 | — | 0 |
| 4 |  Detroit | 49 | 86 | 27 | 3 | 4 | 0 | 0 | — |

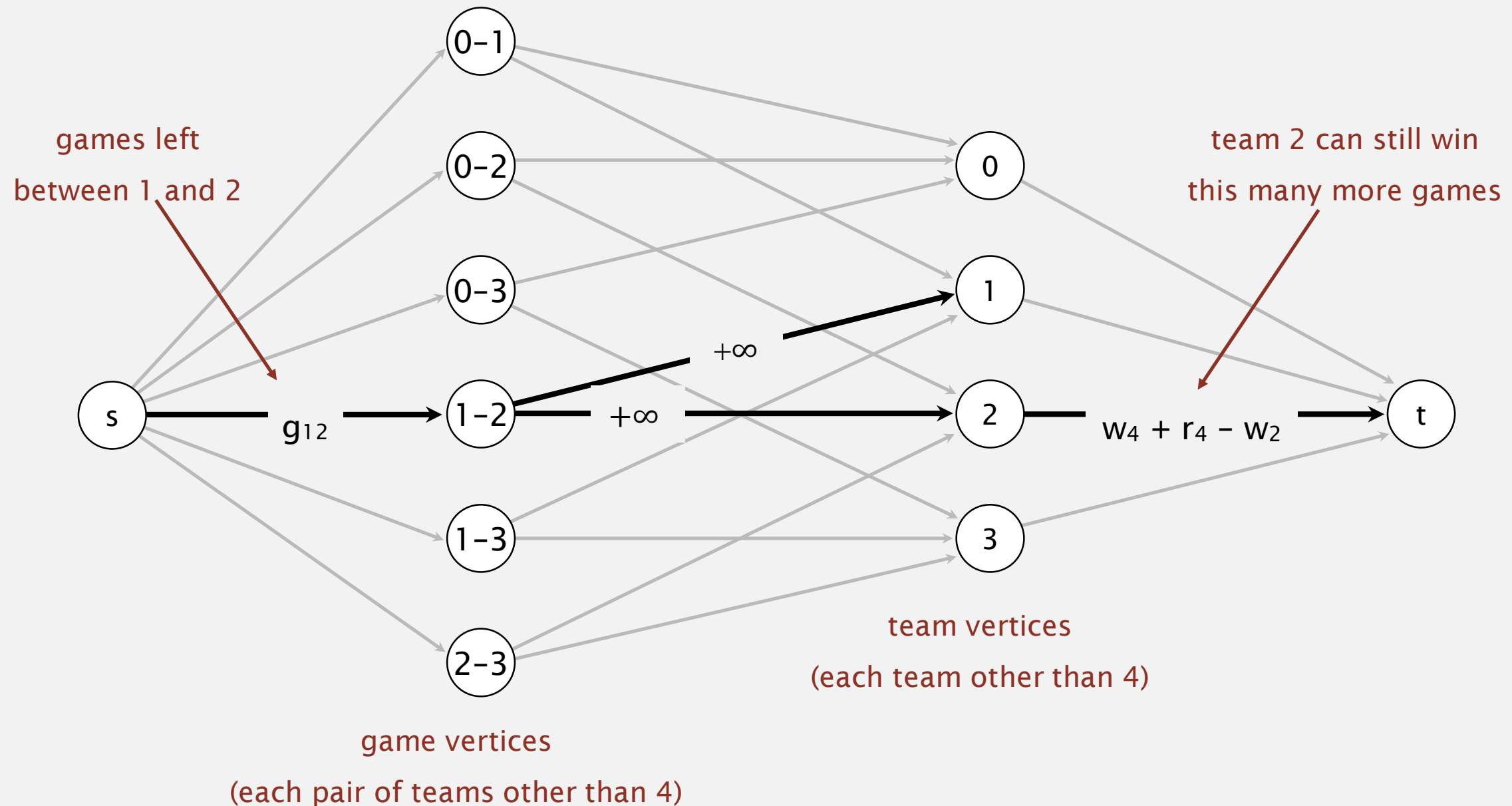
AL East (August 30, 1996)

Detroit is mathematically eliminated.

- Detroit finishes with ≤ 76 wins.
- Wins for $R = \{ \text{NYN, BAL, BOS, TOR} \} = 278$.
- Remaining games among $\{ \text{NYN, BAL, BOS, TOR} \} = 3 + 8 + 7 + 2 + 7 = 27$.
- Average team in R wins $305/4 = 76.25$ games.

Baseball elimination problem: maxflow formulation

Intuition. Remaining games flow from s to t .



Fact. Team 4 not eliminated iff all edges pointing from s are full in maxflow.