



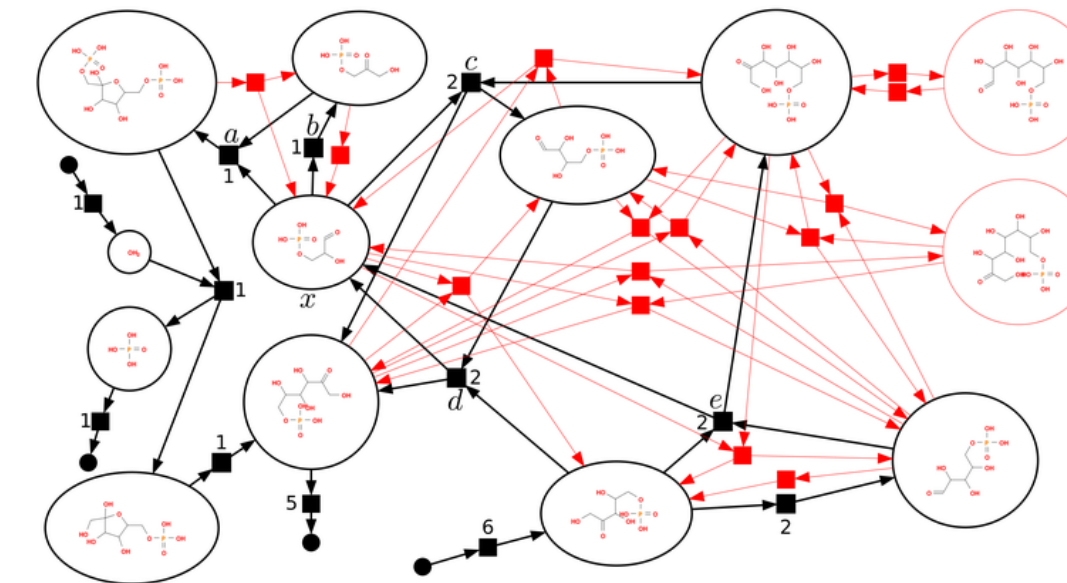
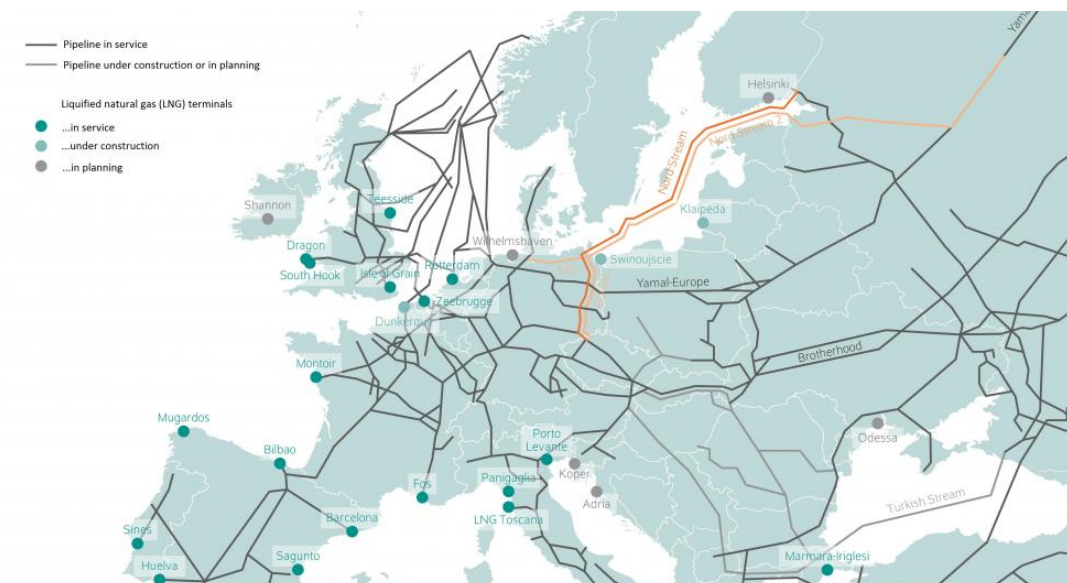
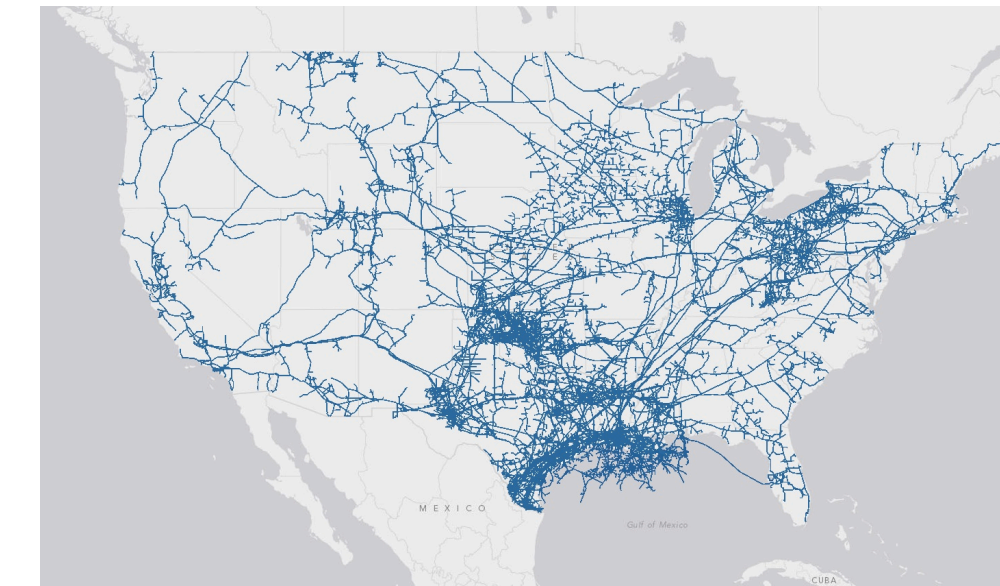
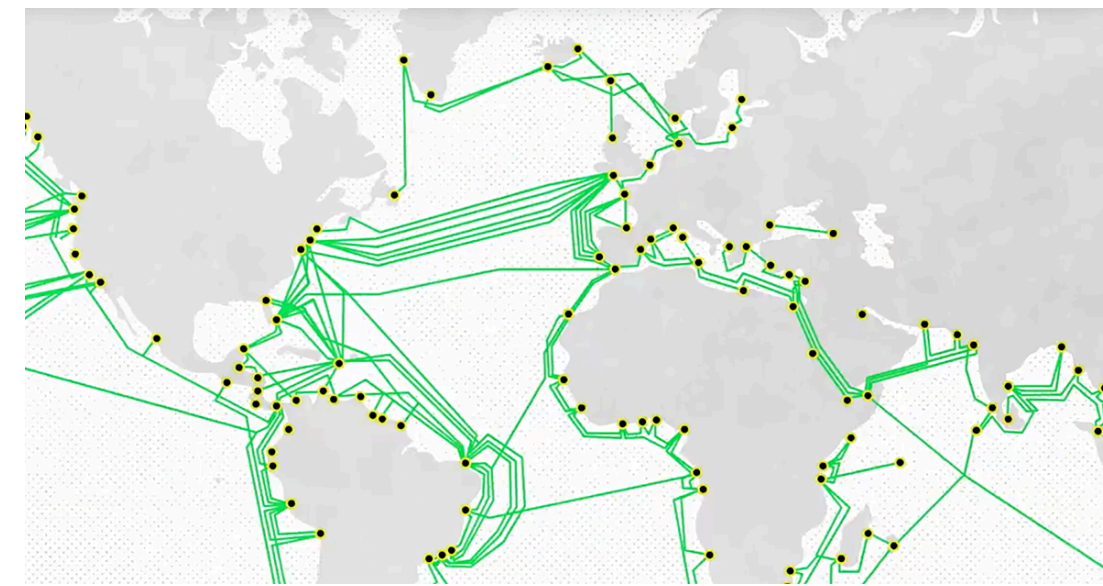
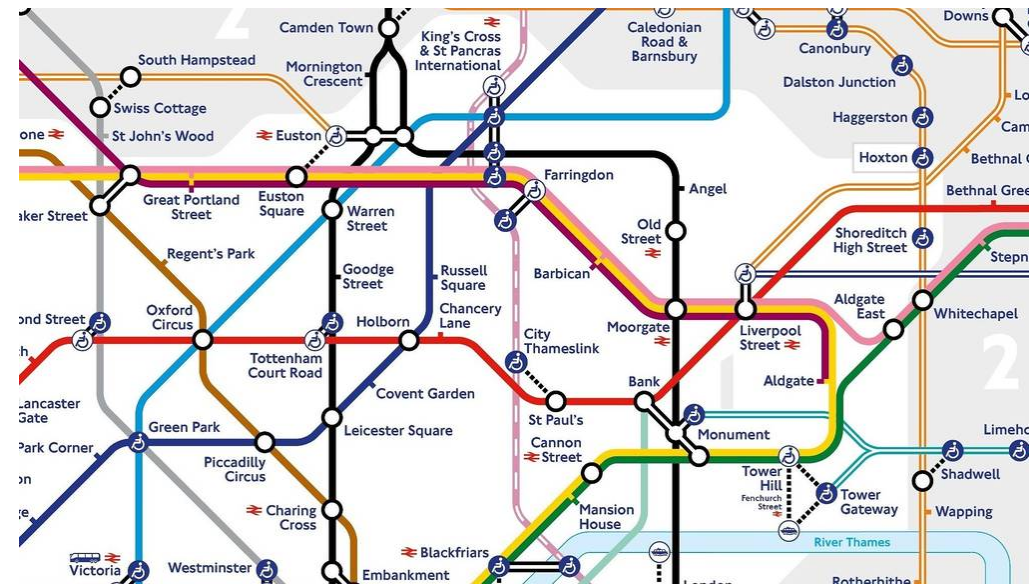
THE UNIVERSITY OF VERMONT  
COLLEGE OF ENGINEERING &  
MATHEMATICAL SCIENCES

# Network Flows

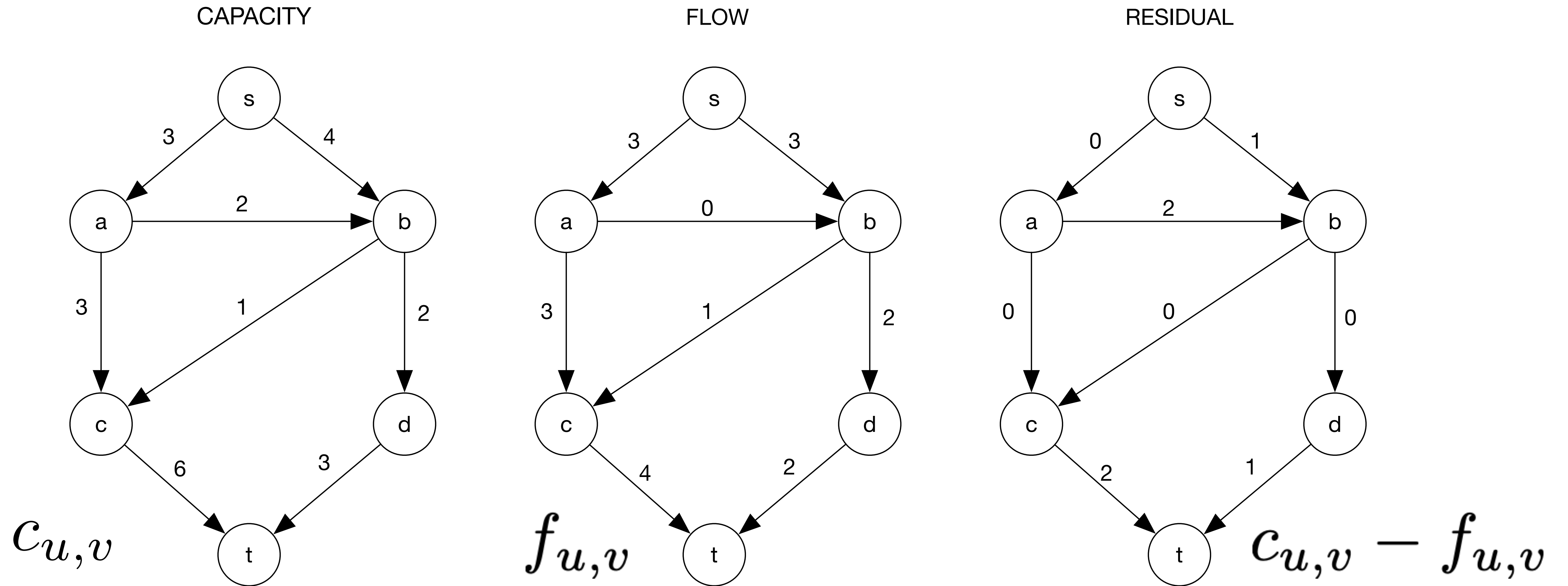
**Max flow / min cut: Ford-Fulkerson, part two**

**CS 124 / Department of Computer Science**

# Network flow



# Network flow



# Network flow

$f_{u,v}$  is the flow from  $u$  to  $v$

$$f_{u,v} \leq c_{u,v}$$

$$\sum_{u:(u,v) \in E} f_{u,v} = \sum_{w:(v,w) \in E} f_{v,w}$$

$$\sum_{u:(s,u) \in E} f_{s,u} = \sum_{w:(w,t) \in E} f_{w,t}$$

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# Network flow

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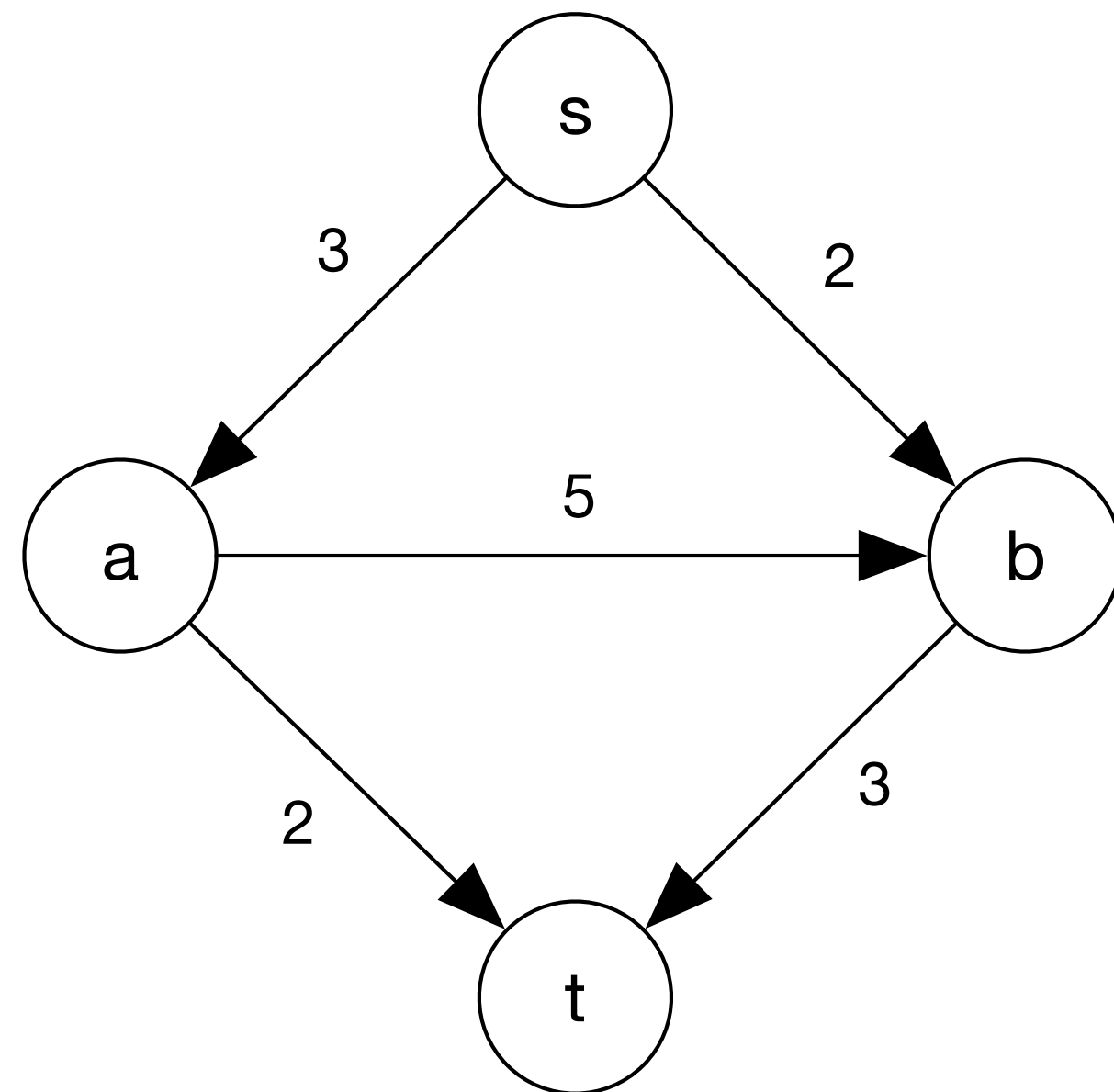
$$f_{u,v} \leq c_{u,v}$$

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$$\sum_{u:(s,u) \in E} = \sum_{w:(w,t) \in E}$$

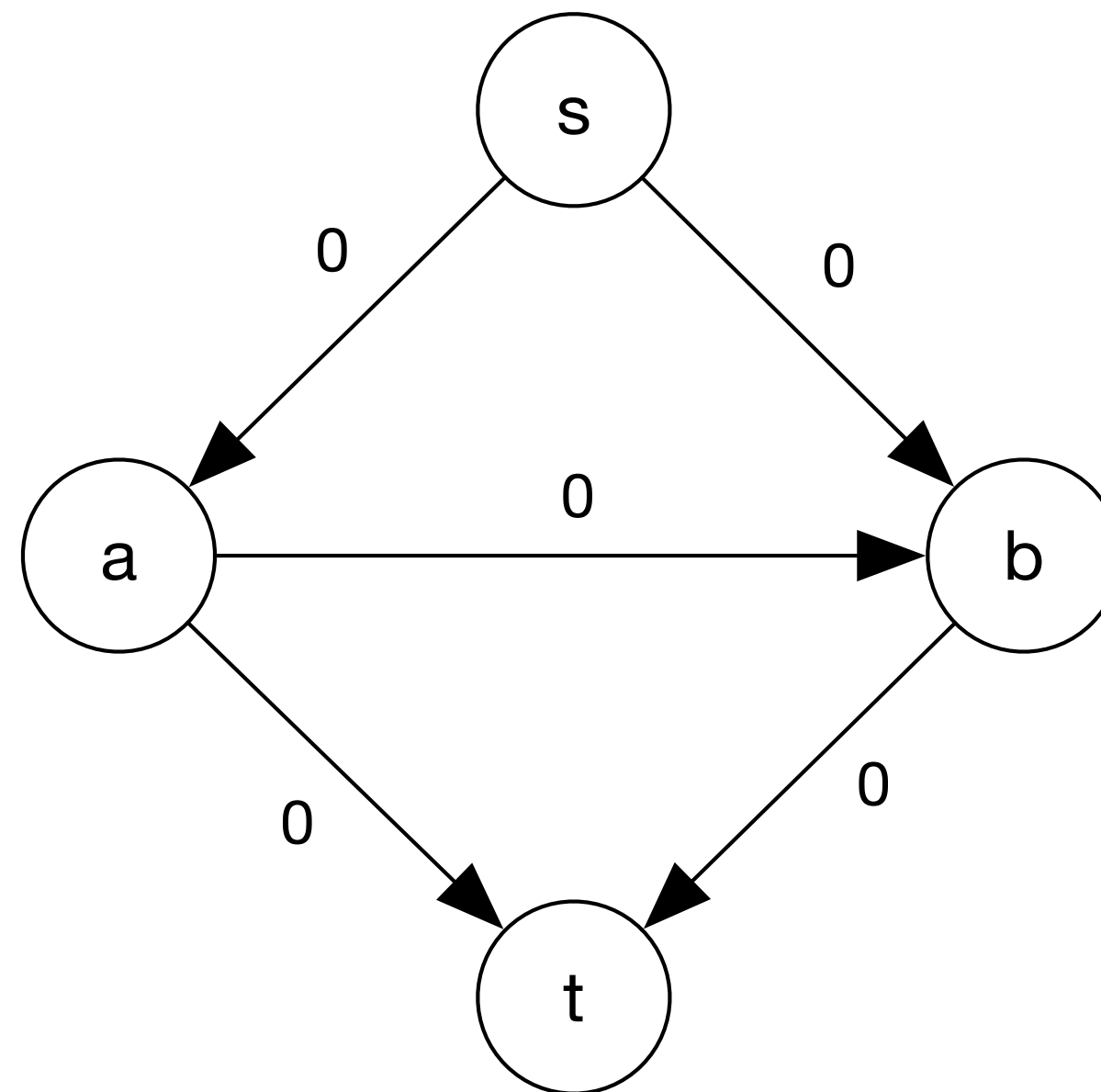
# Network flow

CAPACITY



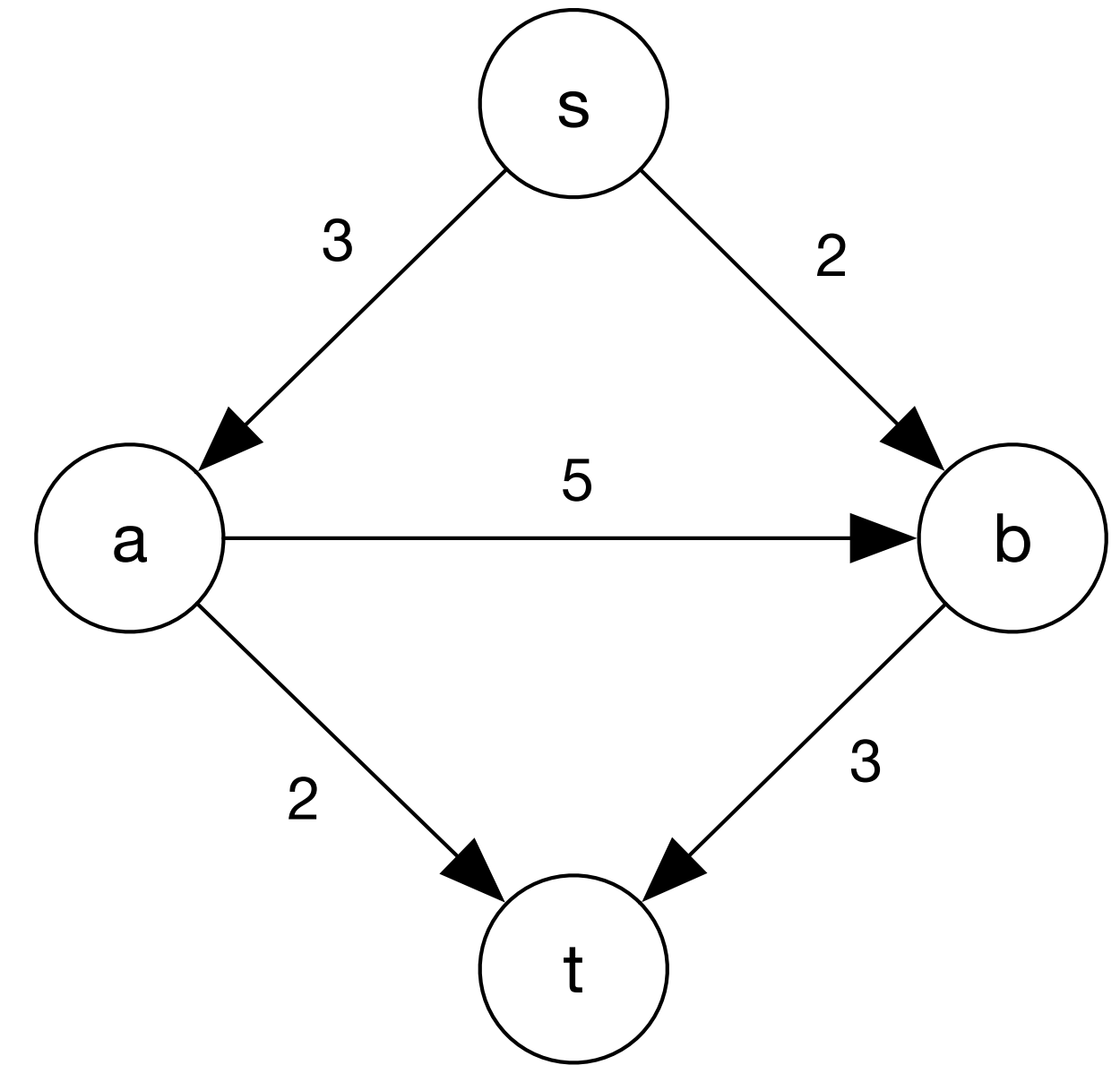
$$C_{u,v}$$

FLOW



$$f_{u,v}$$

RESIDUAL

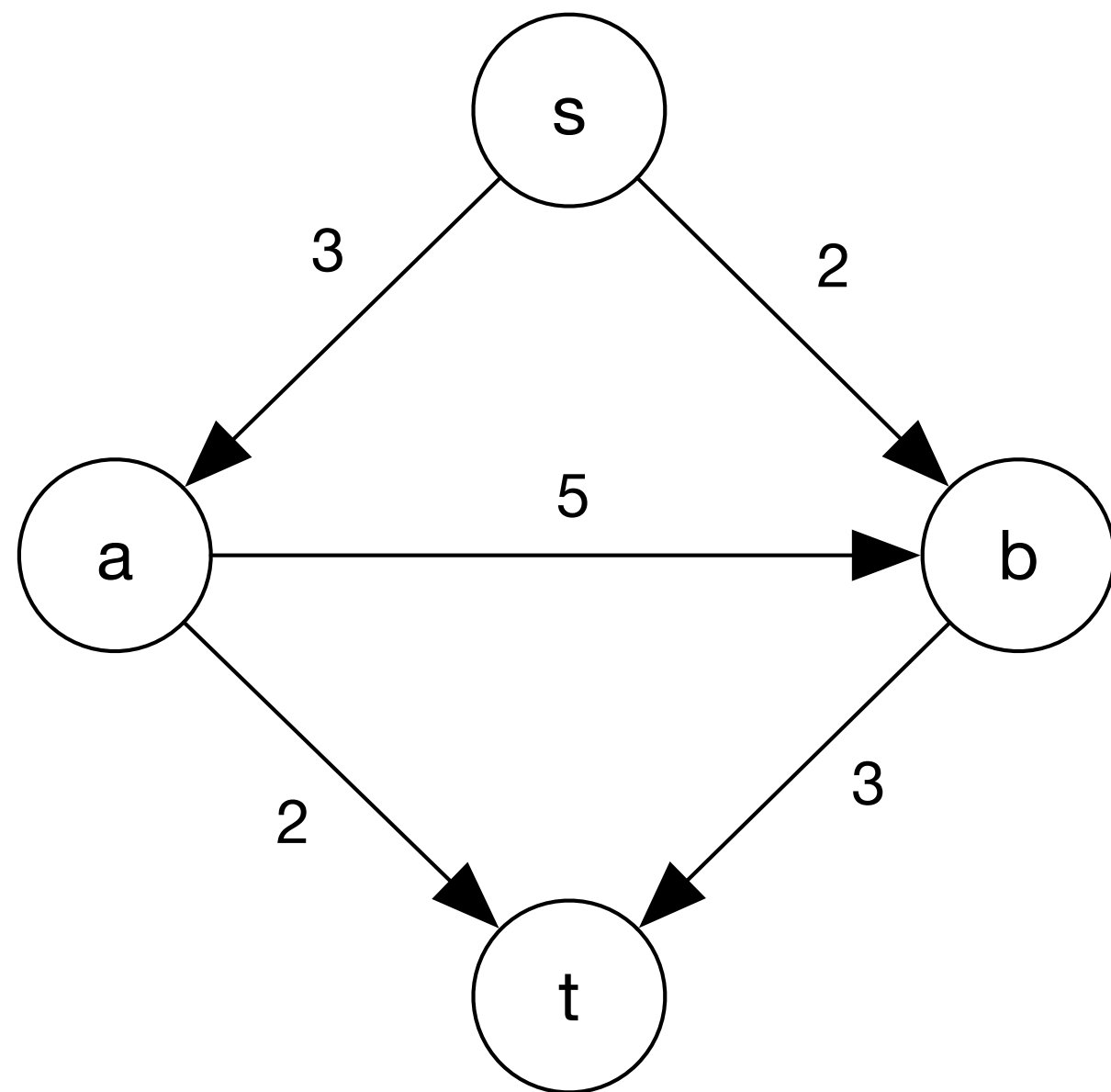


$$C_{u,v} - f_{u,v}$$

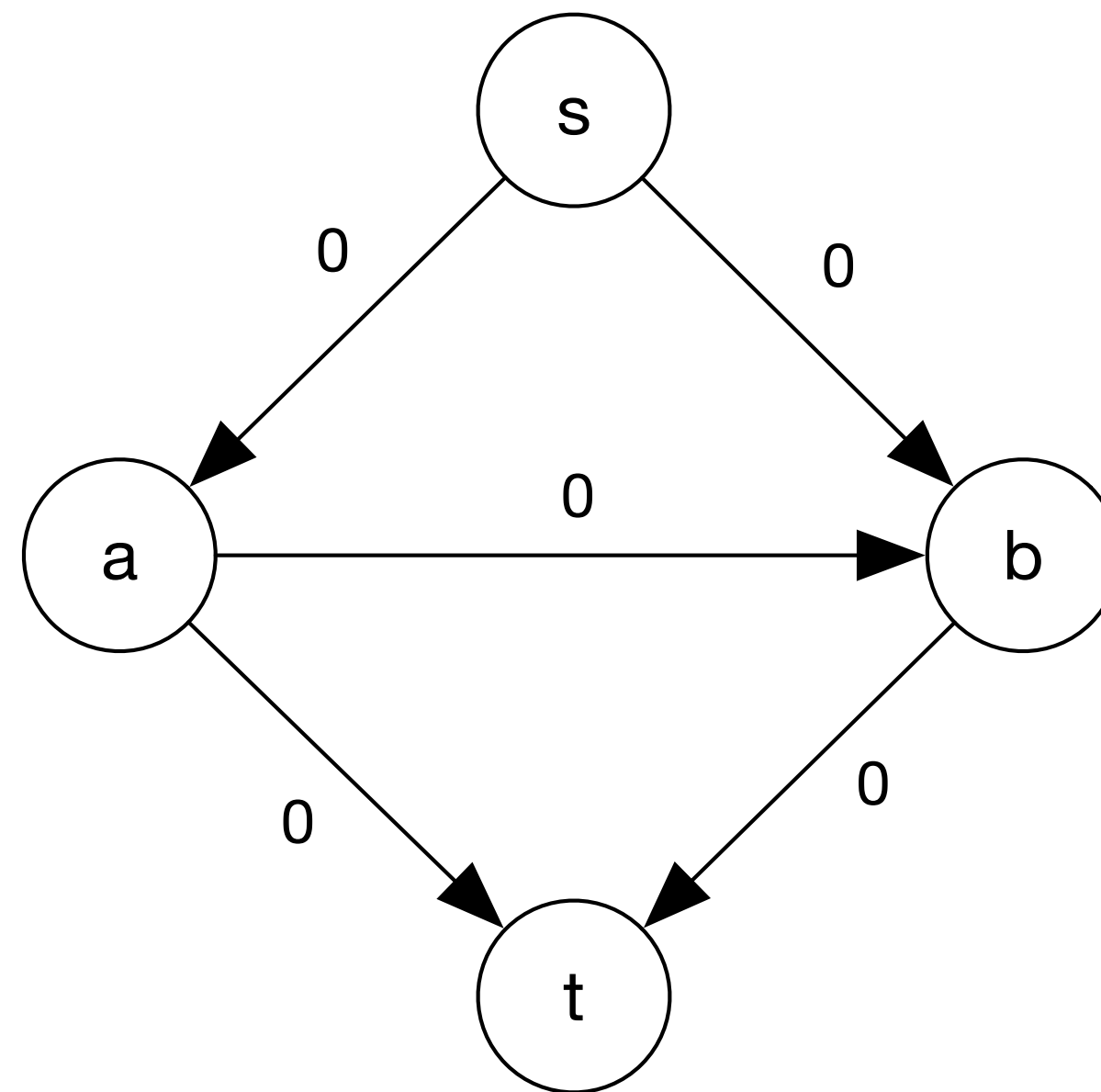


# Network flow

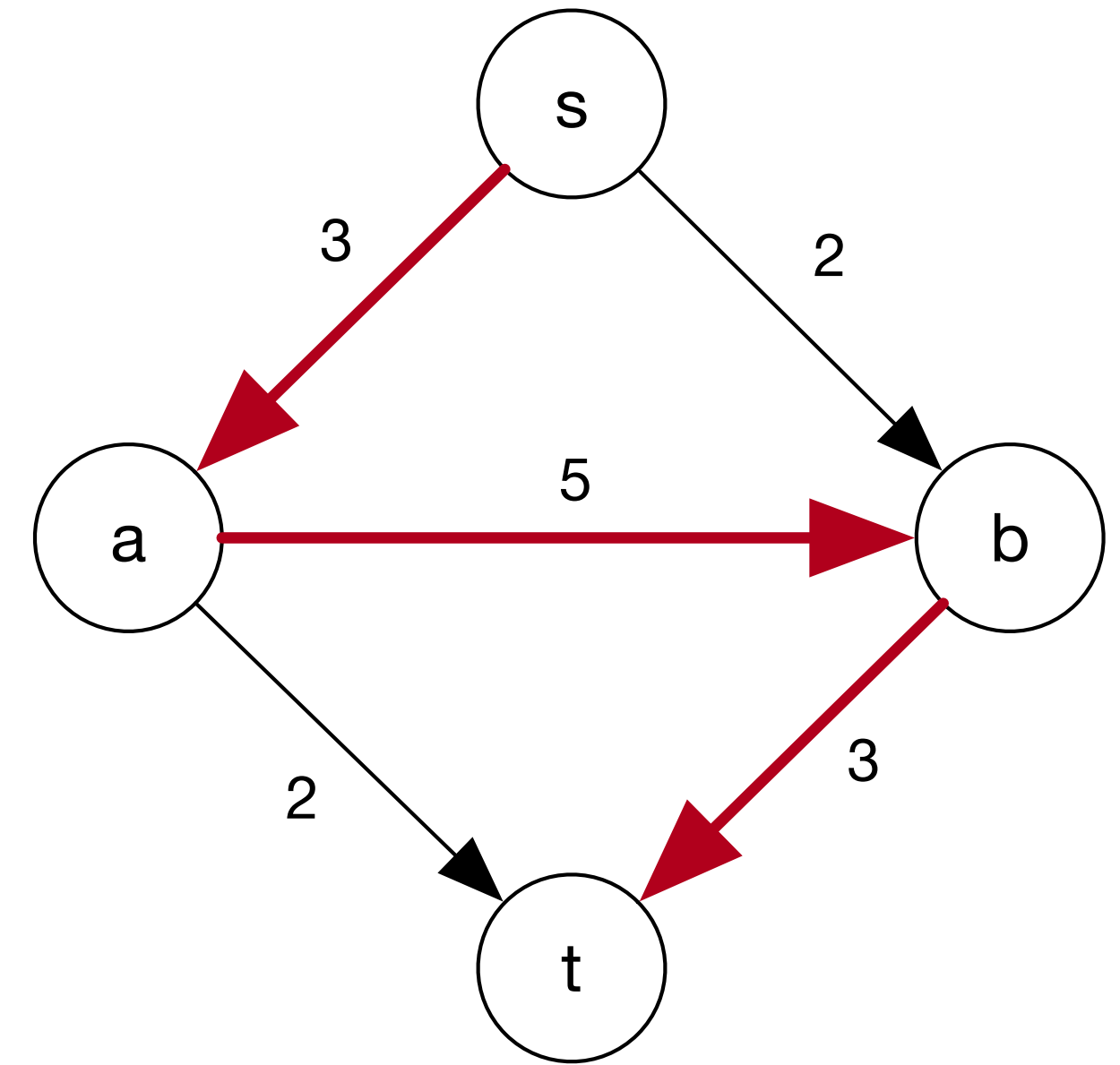
CAPACITY



FLOW

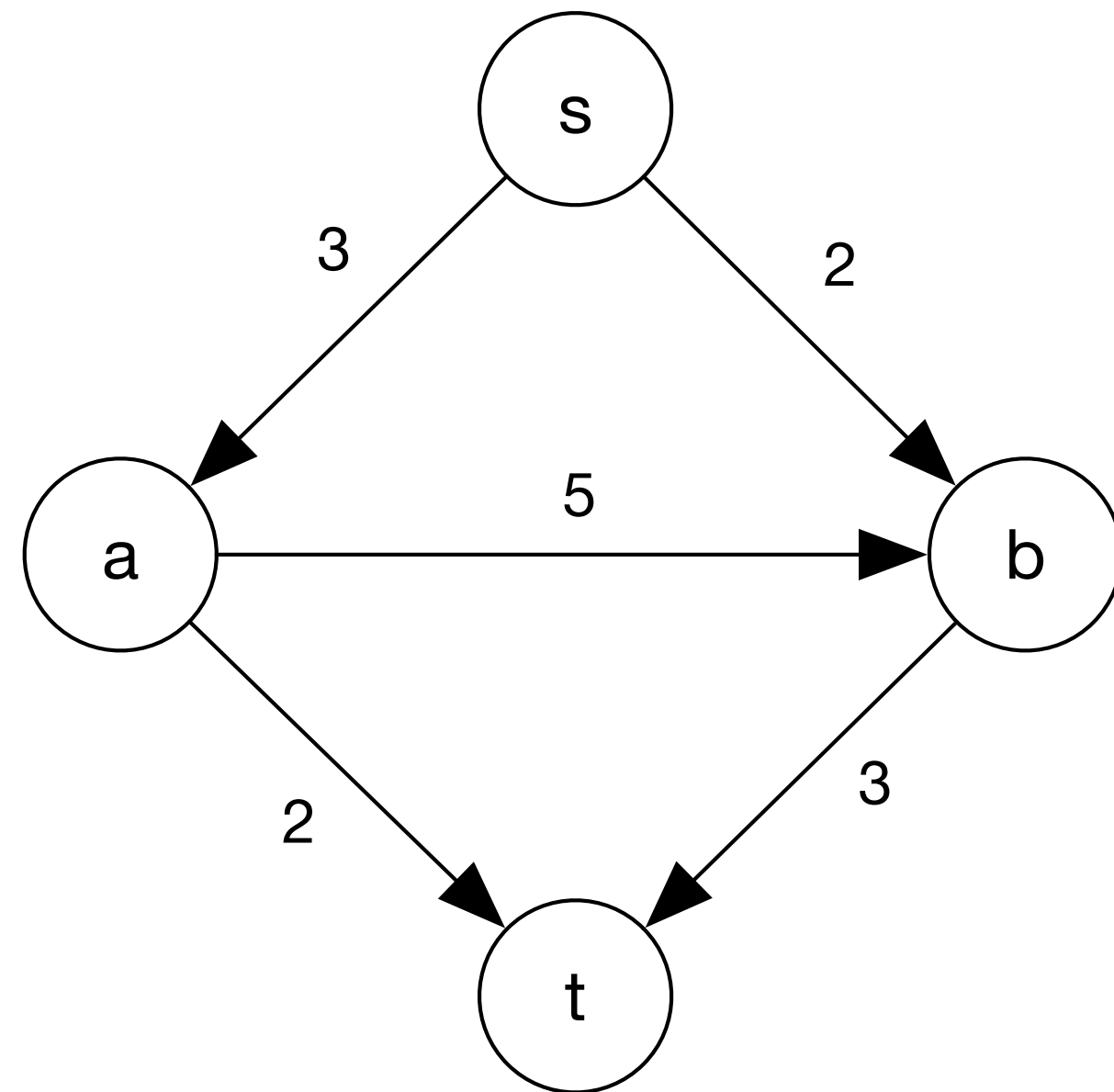


RESIDUAL

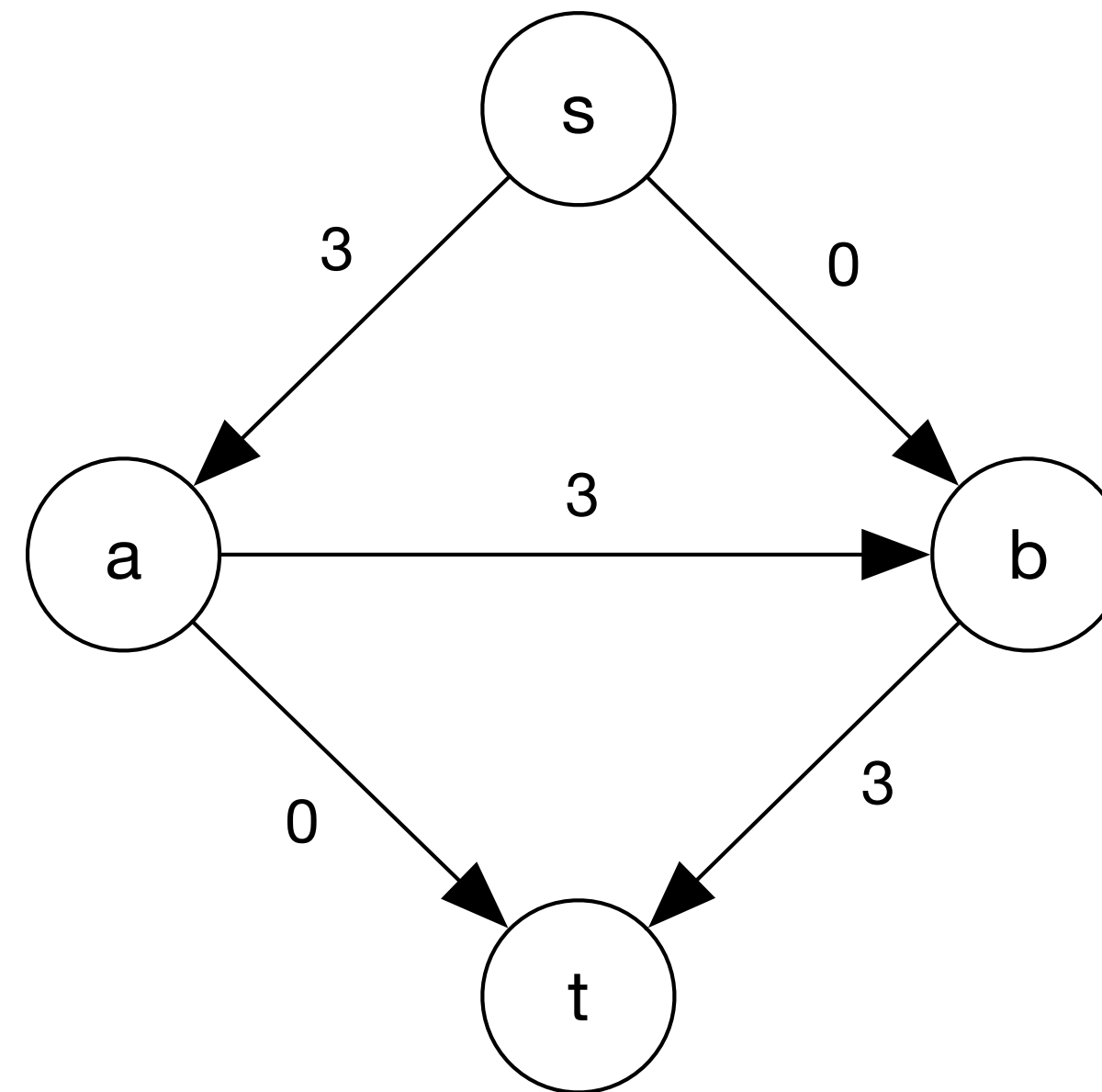


# Network flow

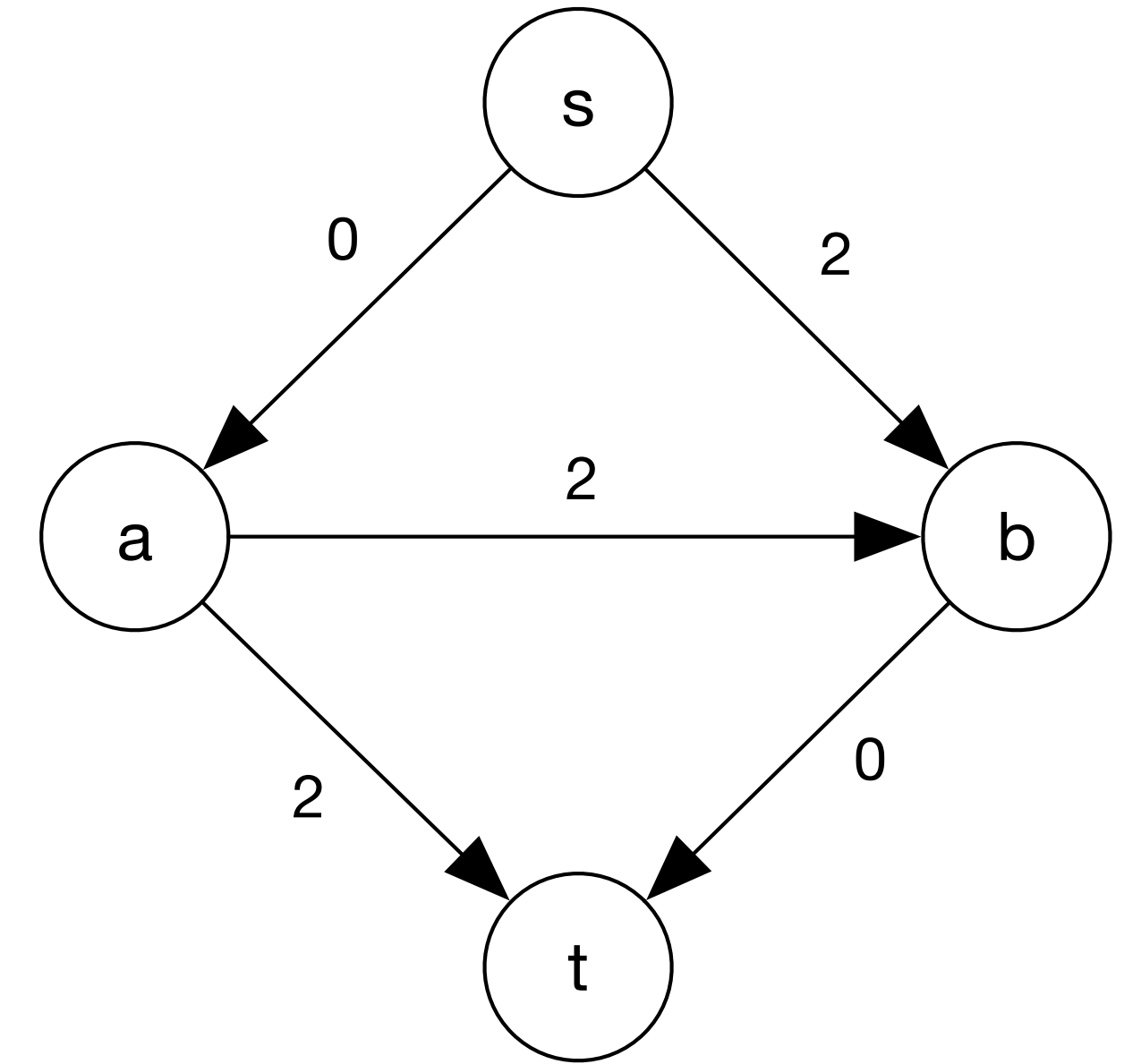
CAPACITY



FLOW



RESIDUAL

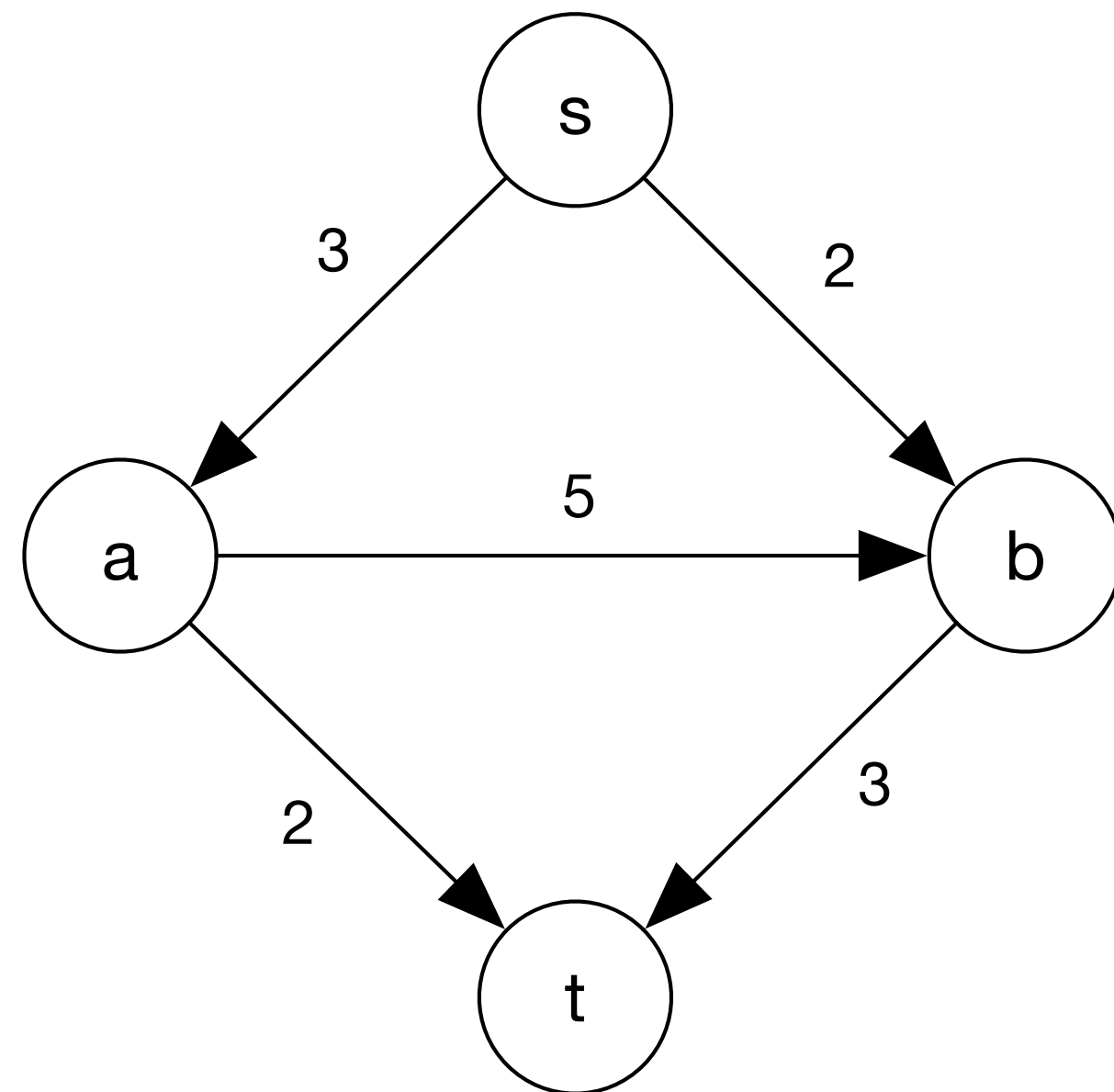


We have a problem!

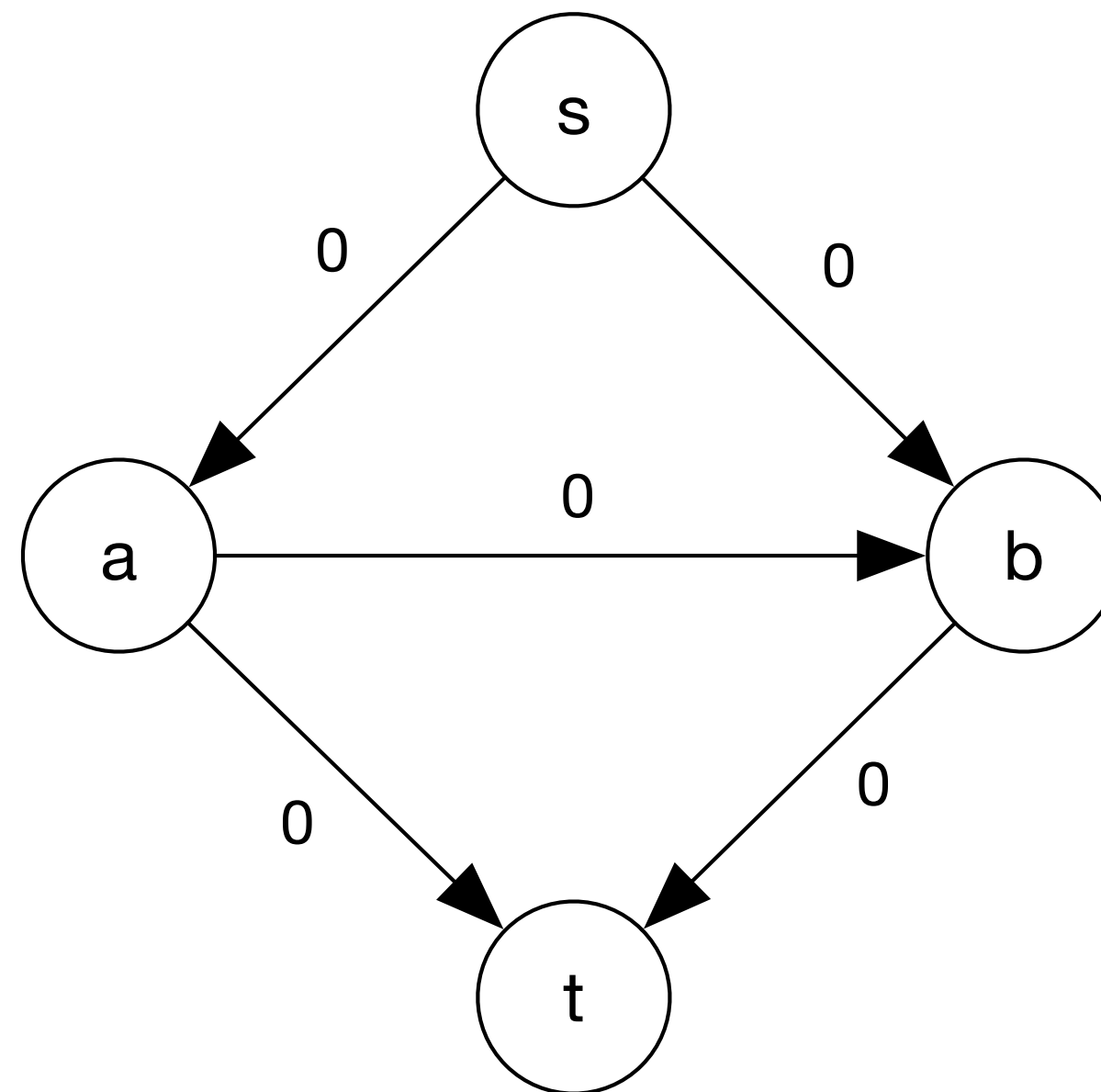
# Network flow

Start over!

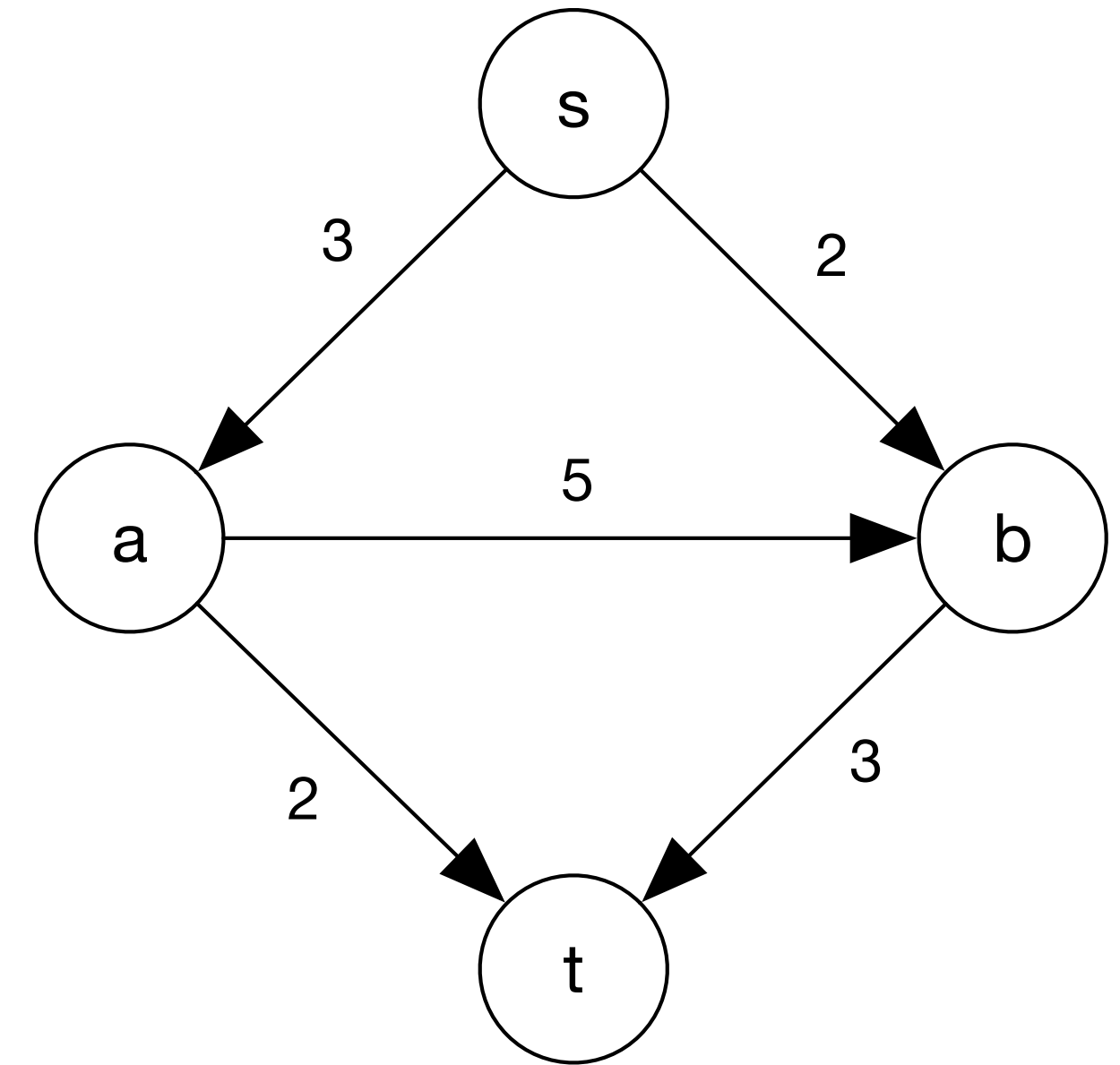
CAPACITY



FLOW

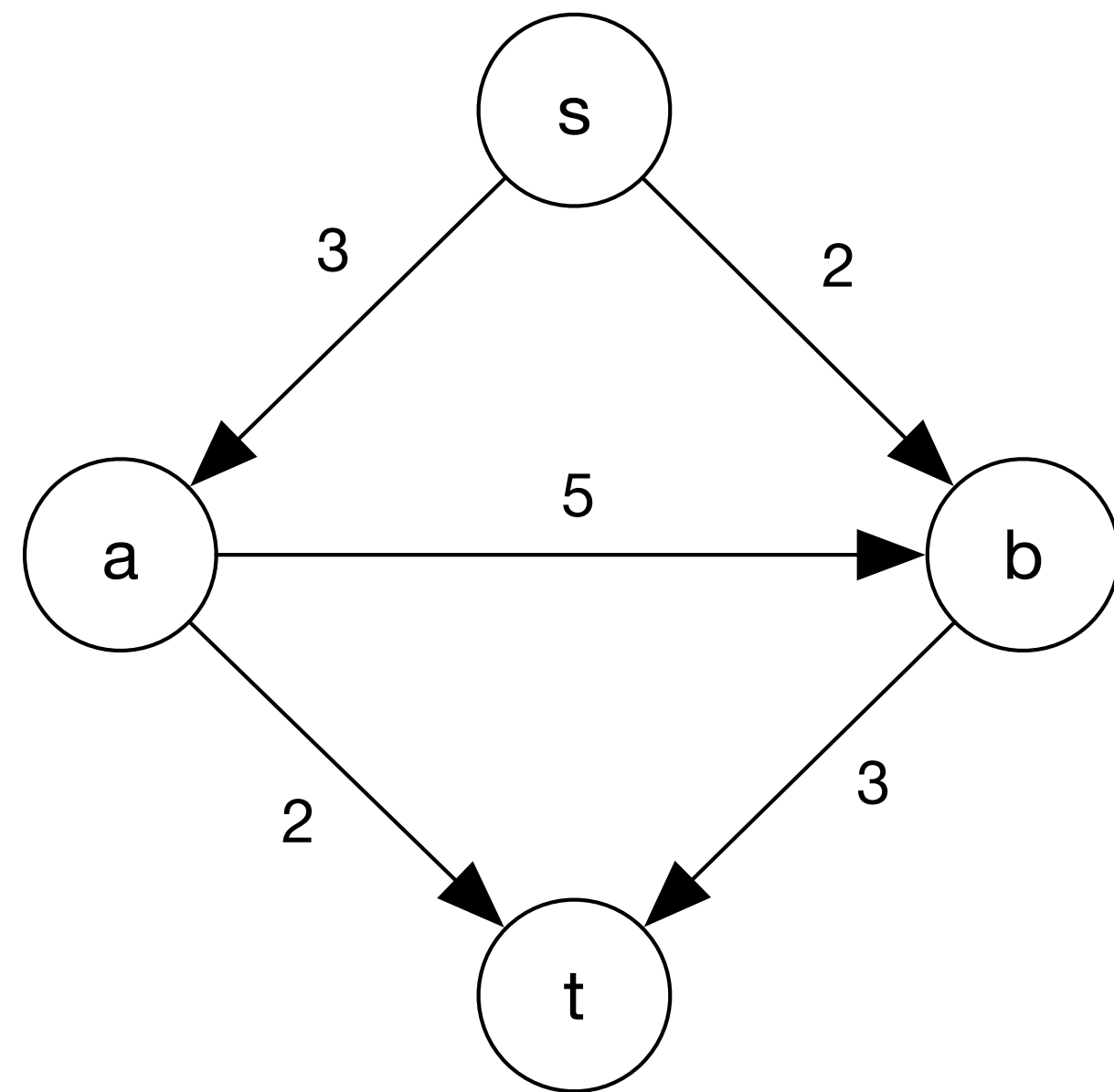


RESIDUAL

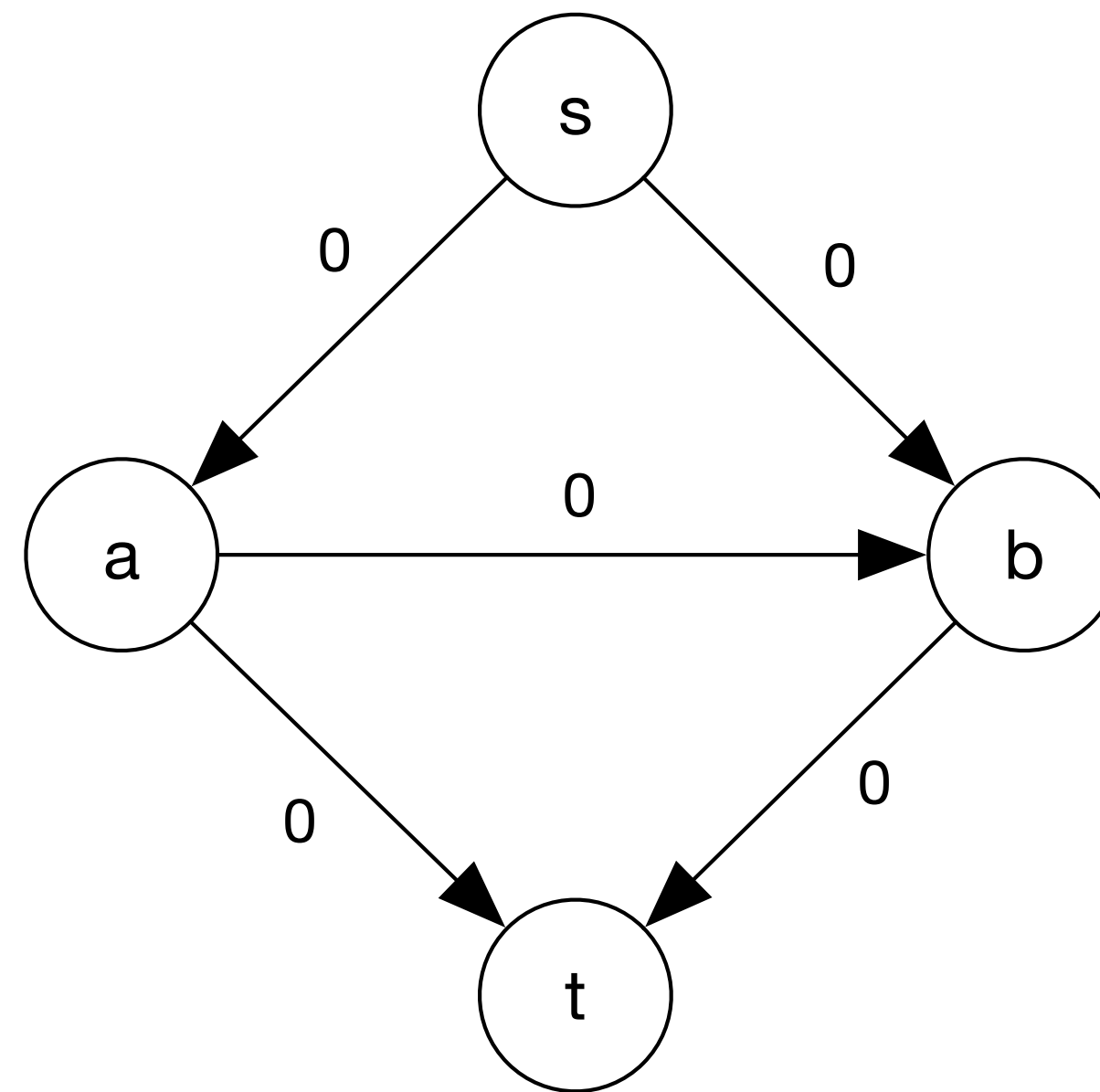


# Network flow

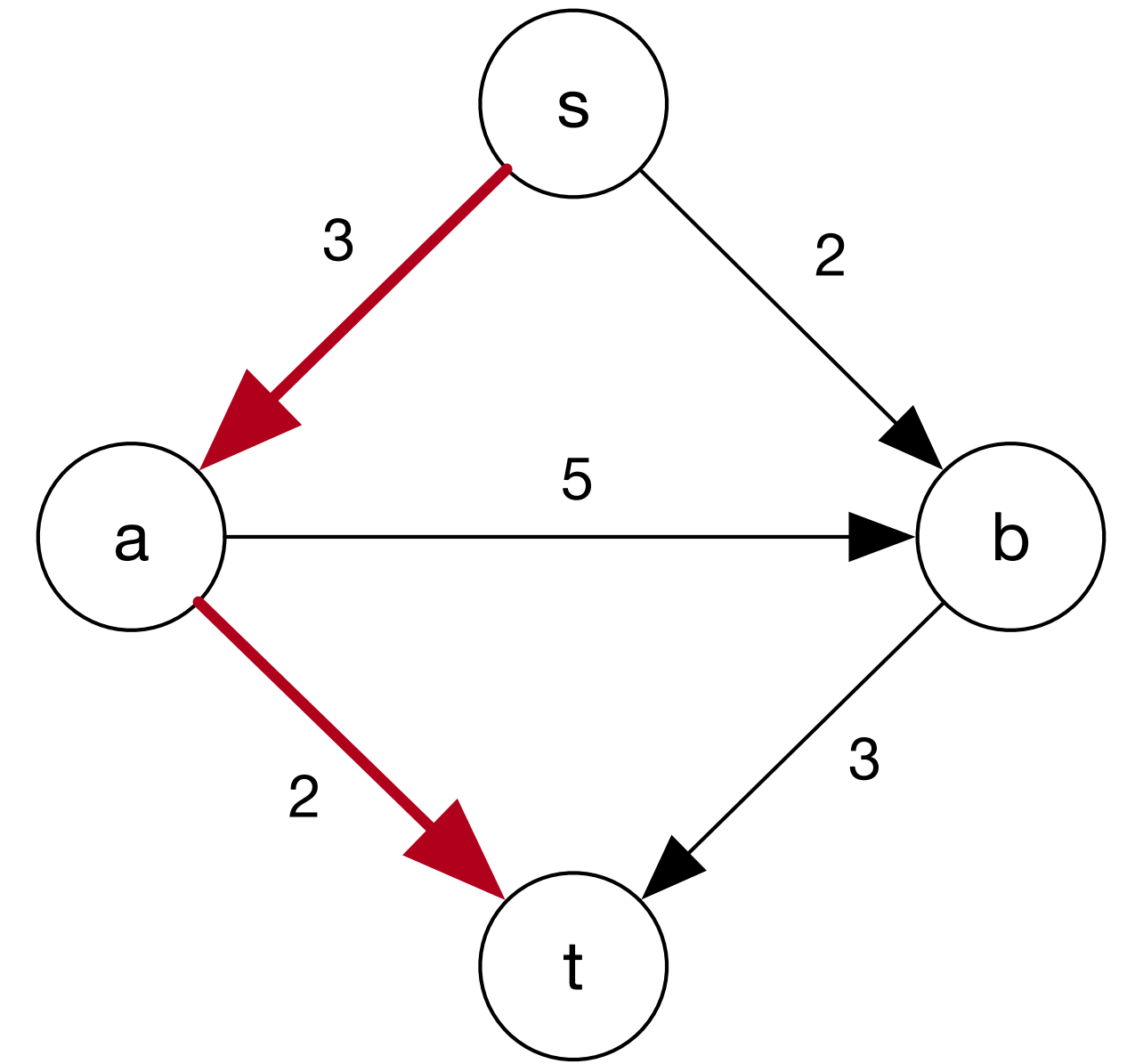
CAPACITY



FLOW

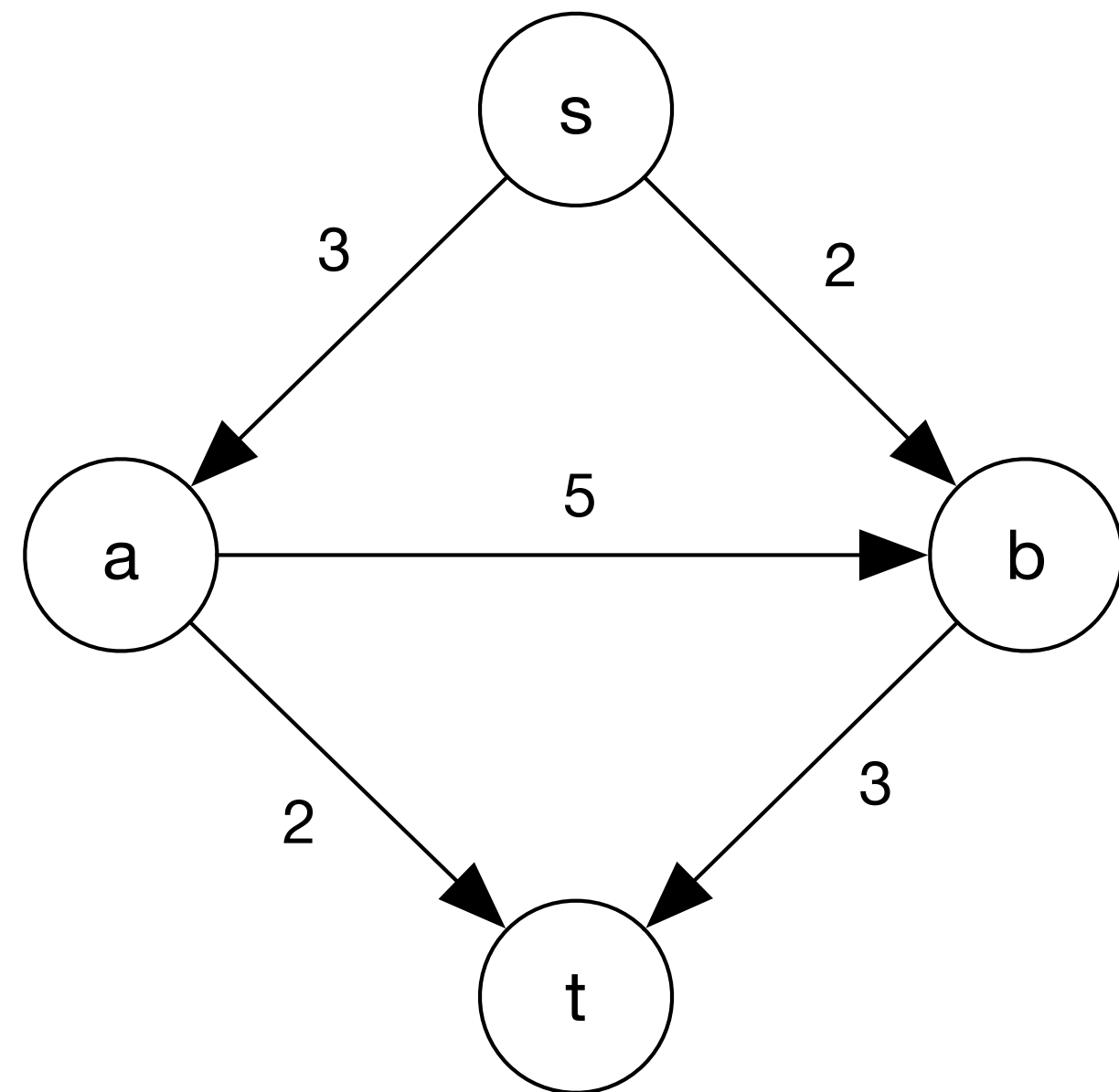


RESIDUAL

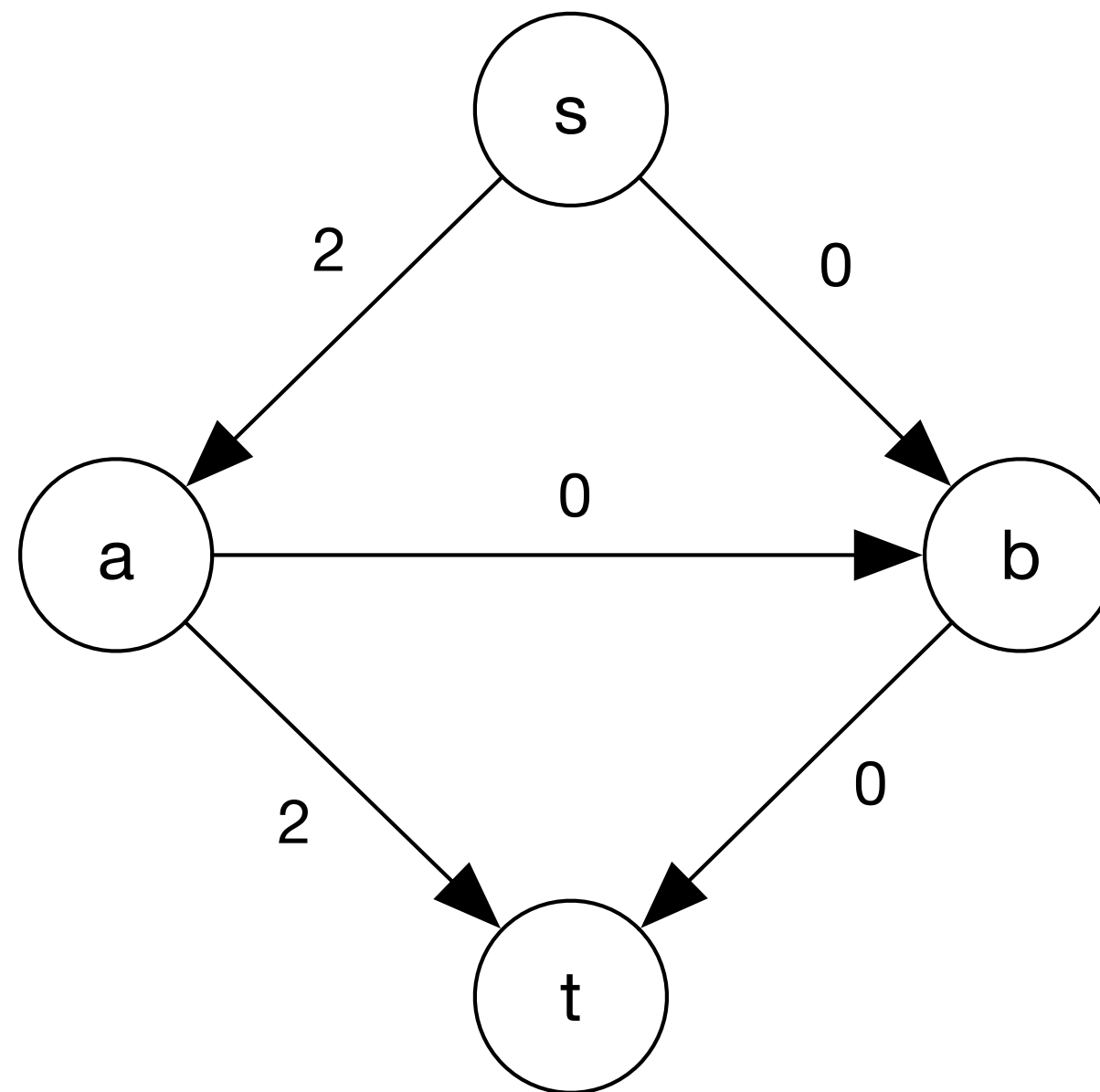


# Network flow

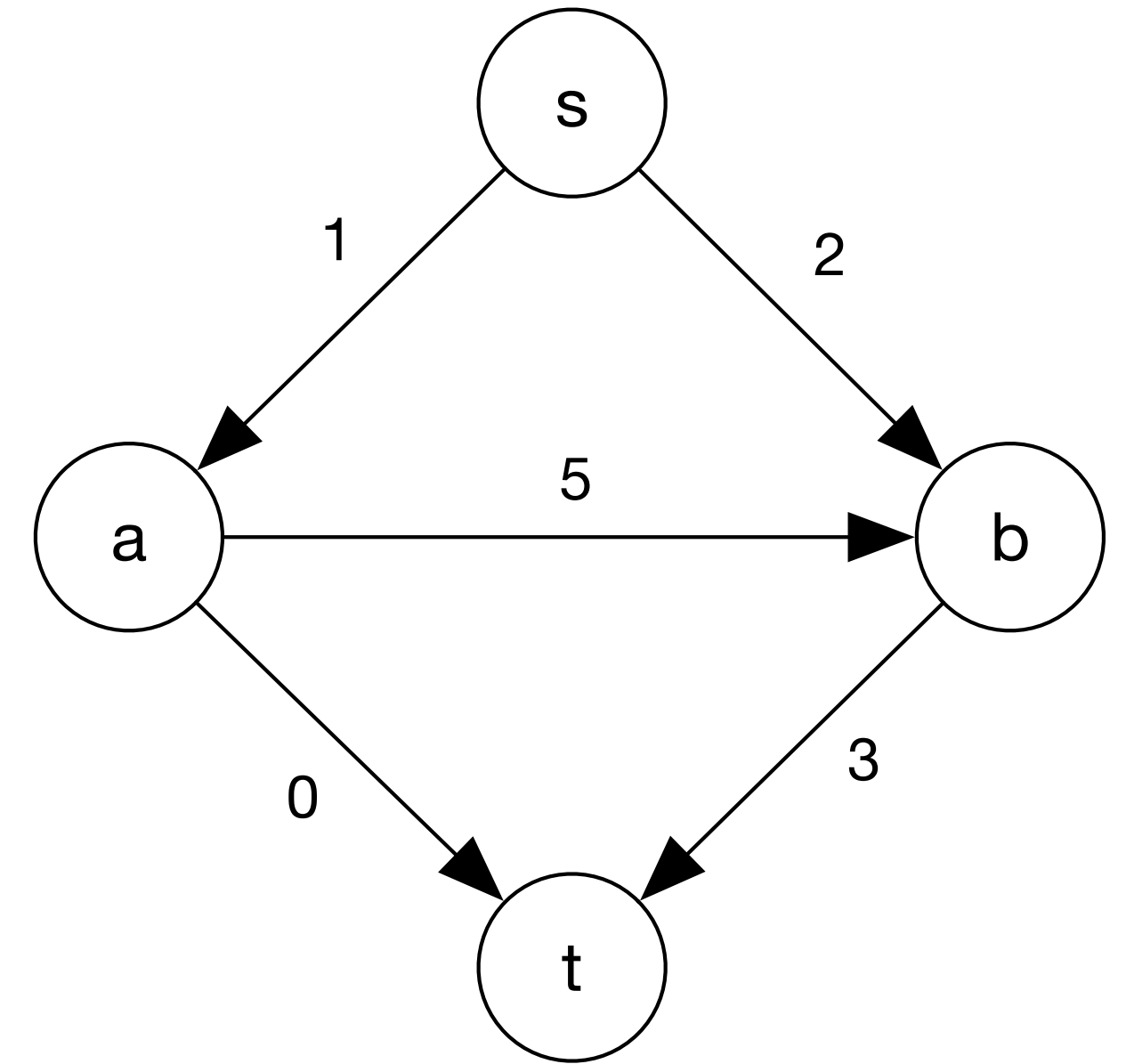
CAPACITY



FLOW

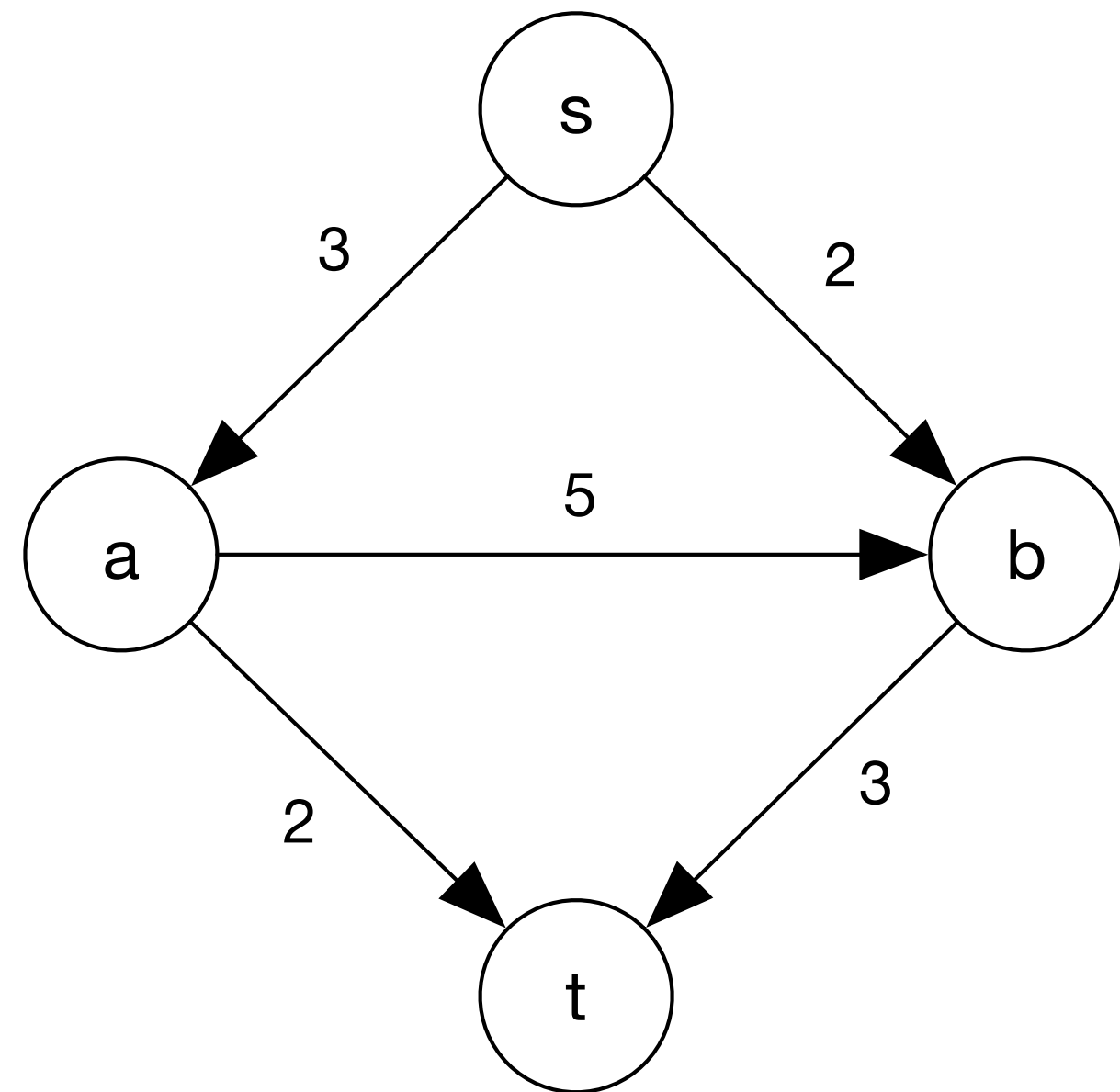


RESIDUAL

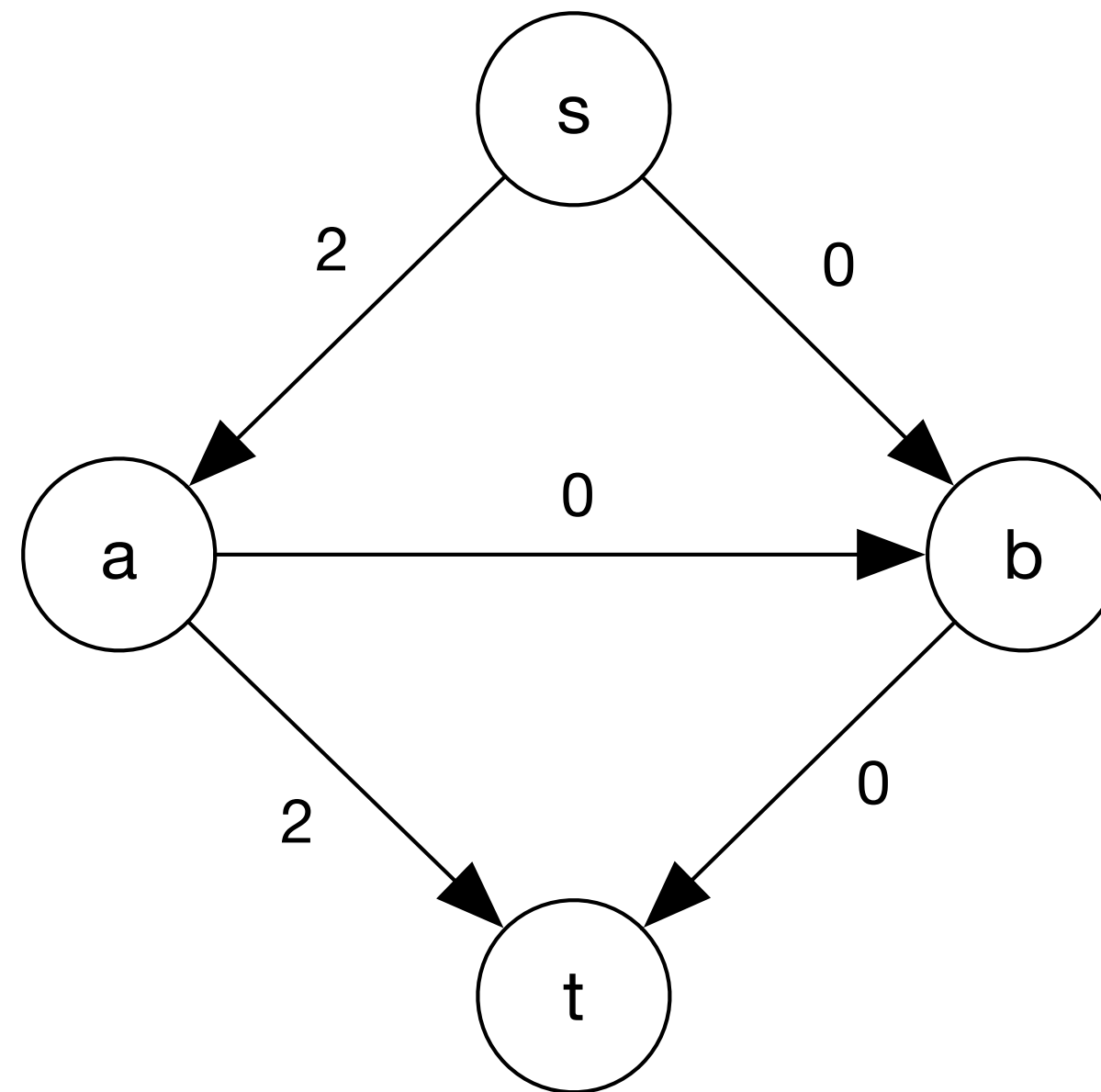


# Network flow

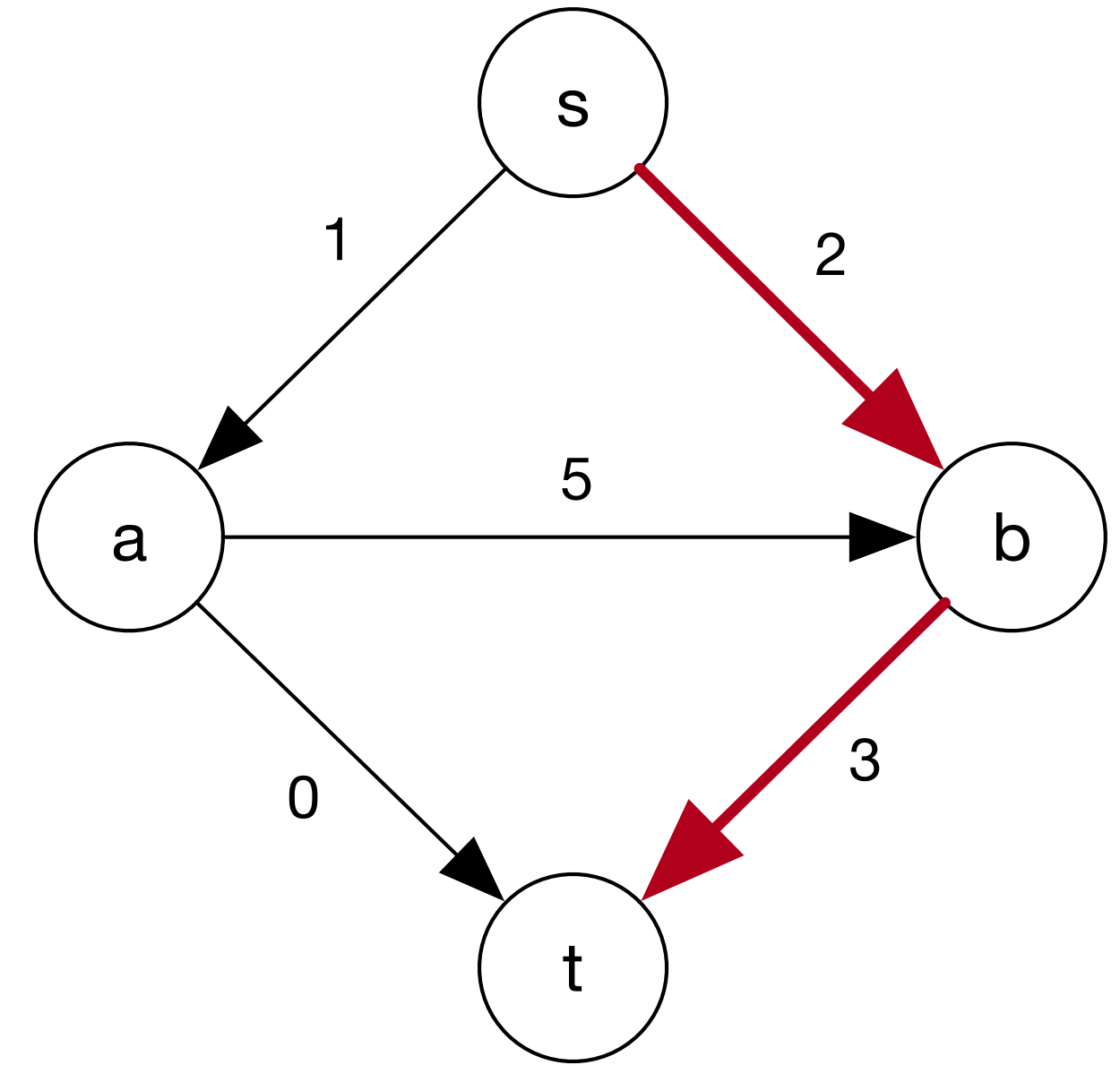
CAPACITY



FLOW

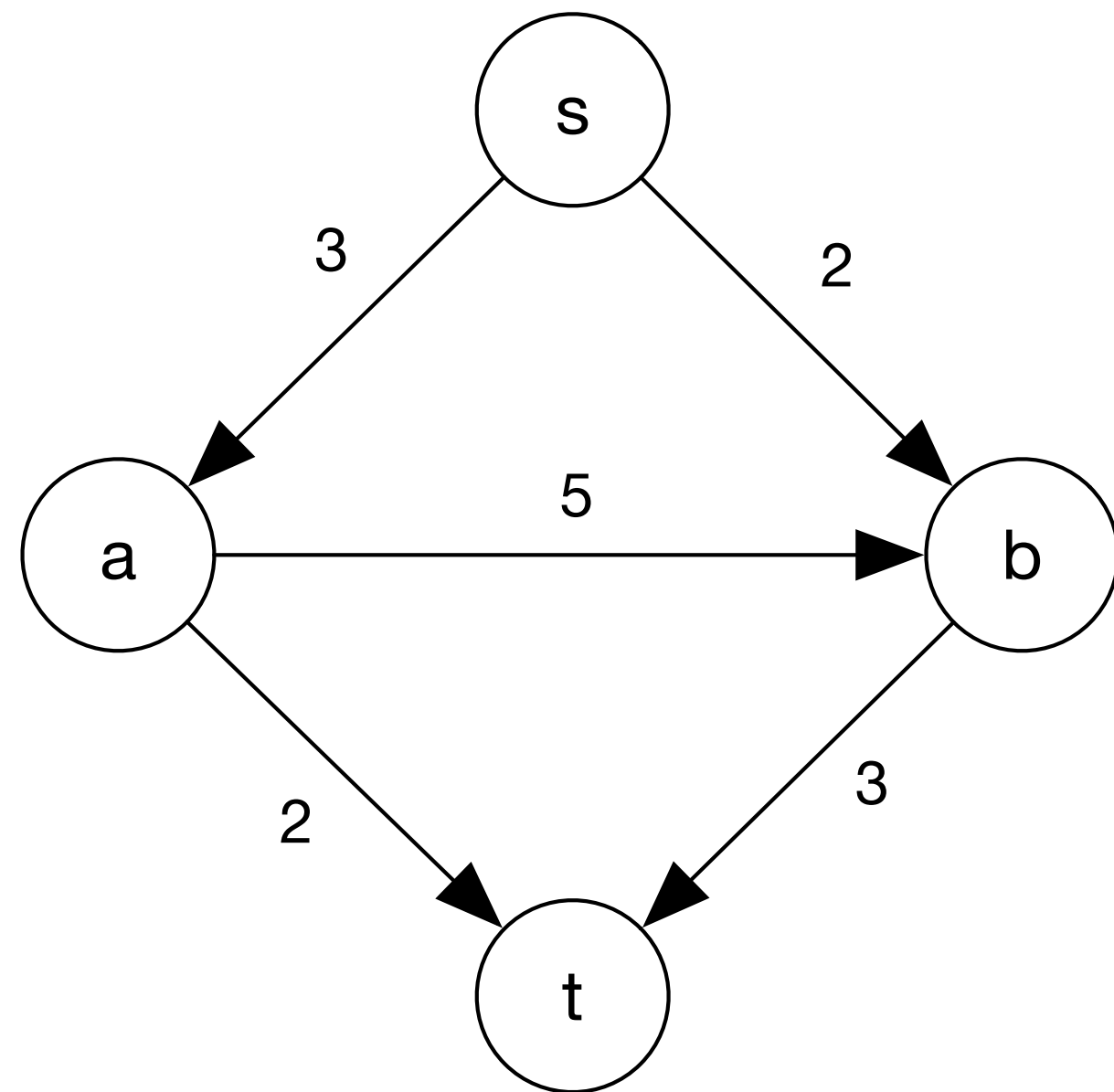


RESIDUAL

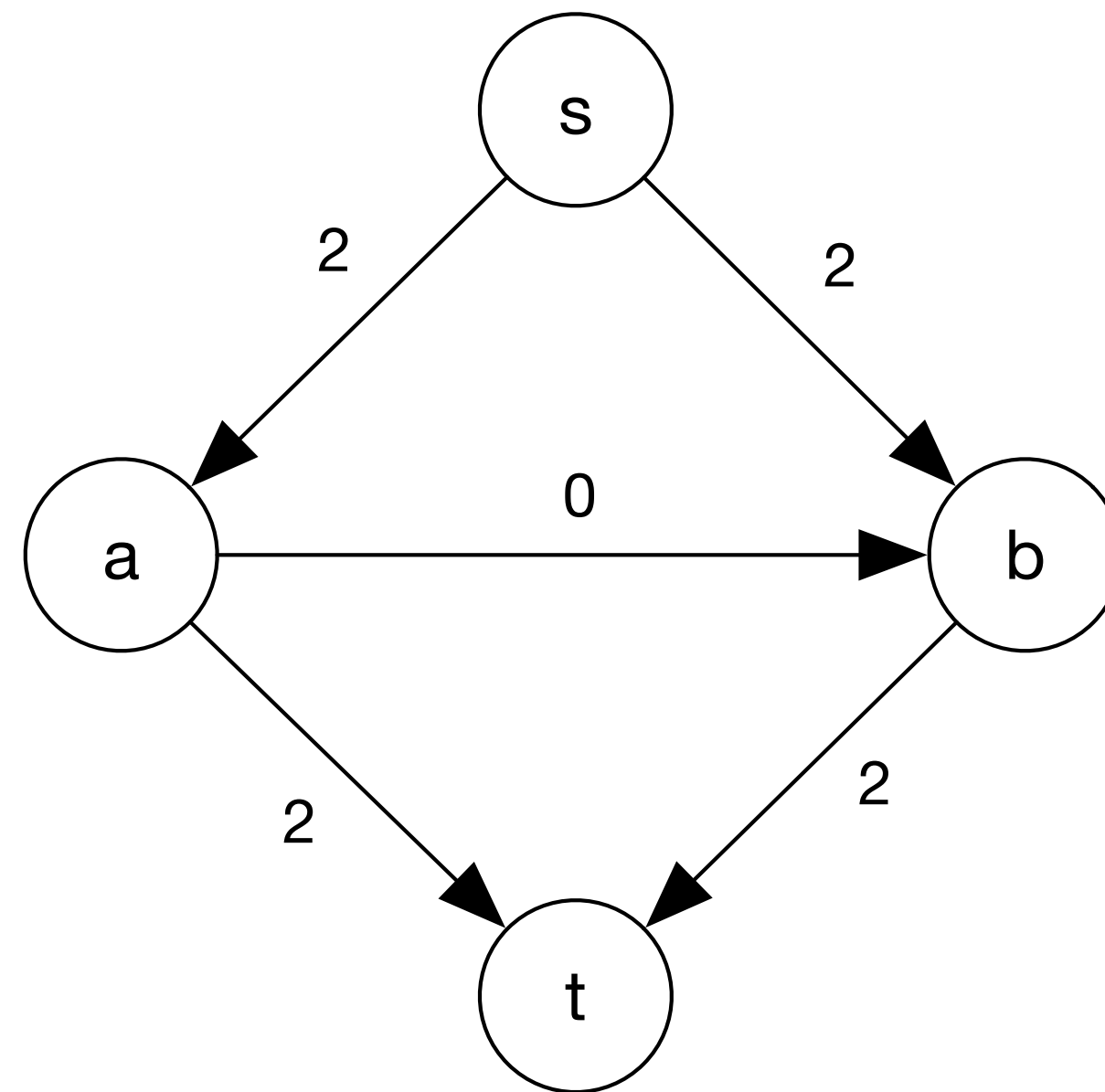


# Network flow

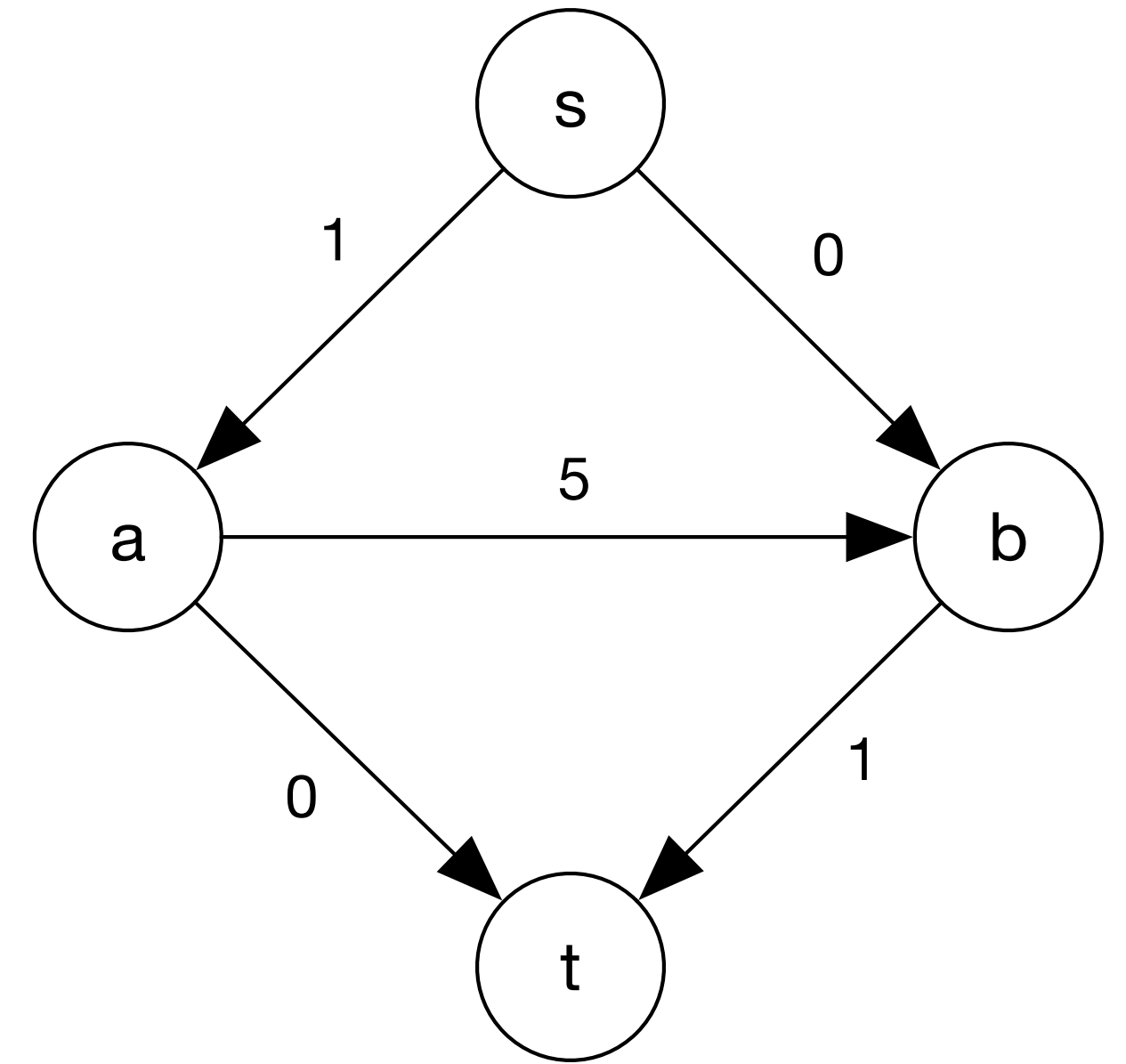
CAPACITY



FLOW

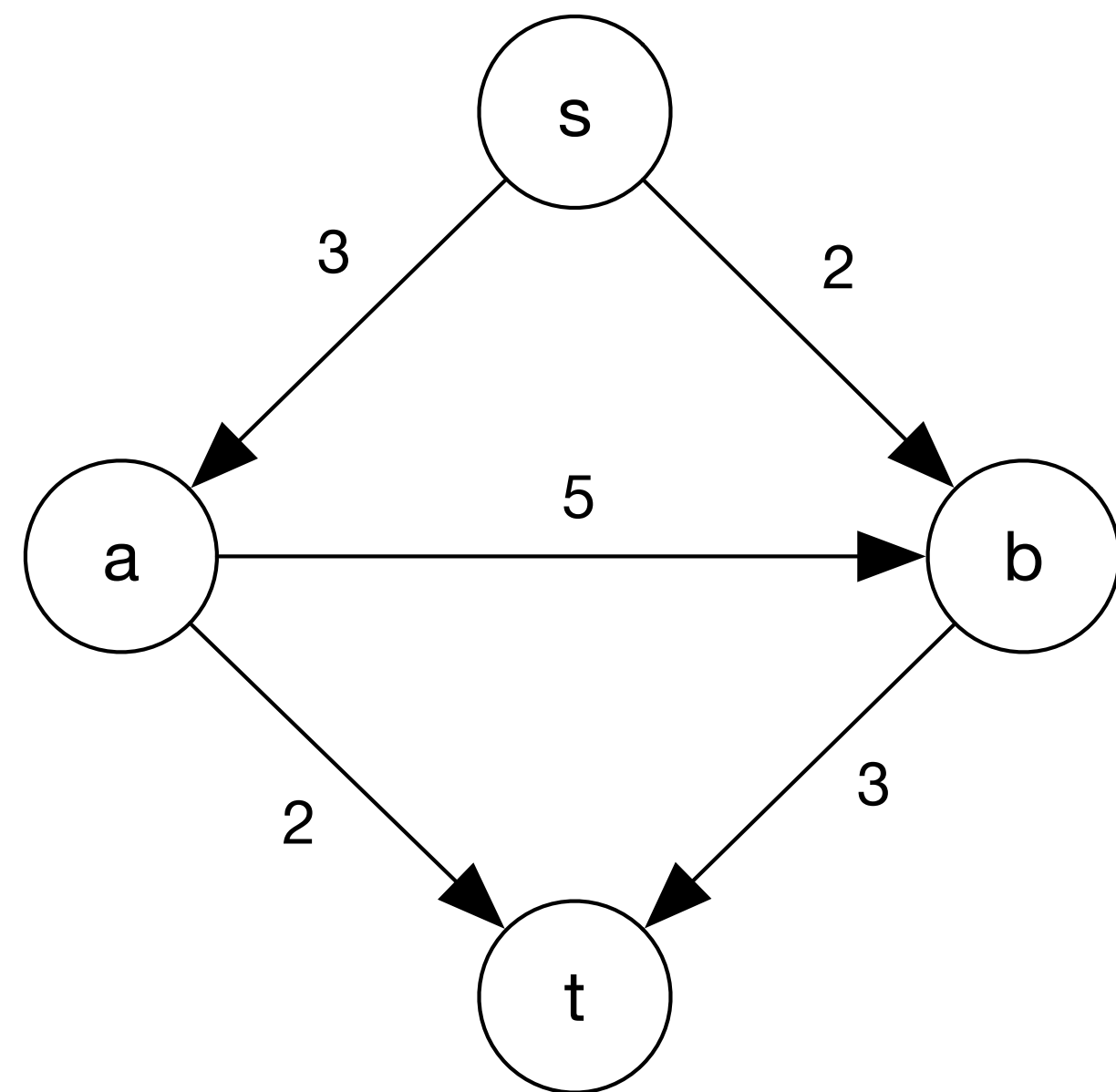


RESIDUAL

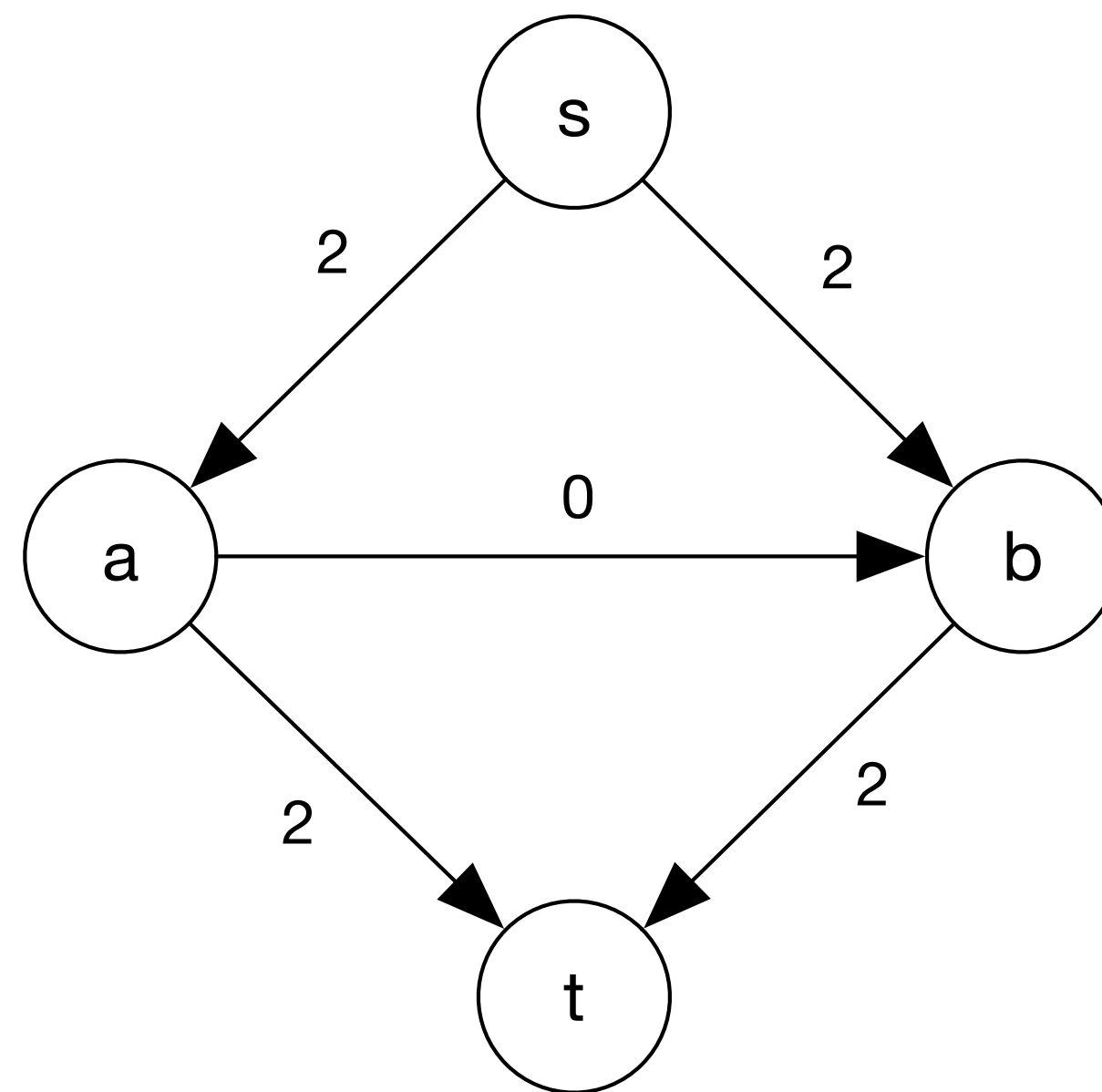


# Network flow

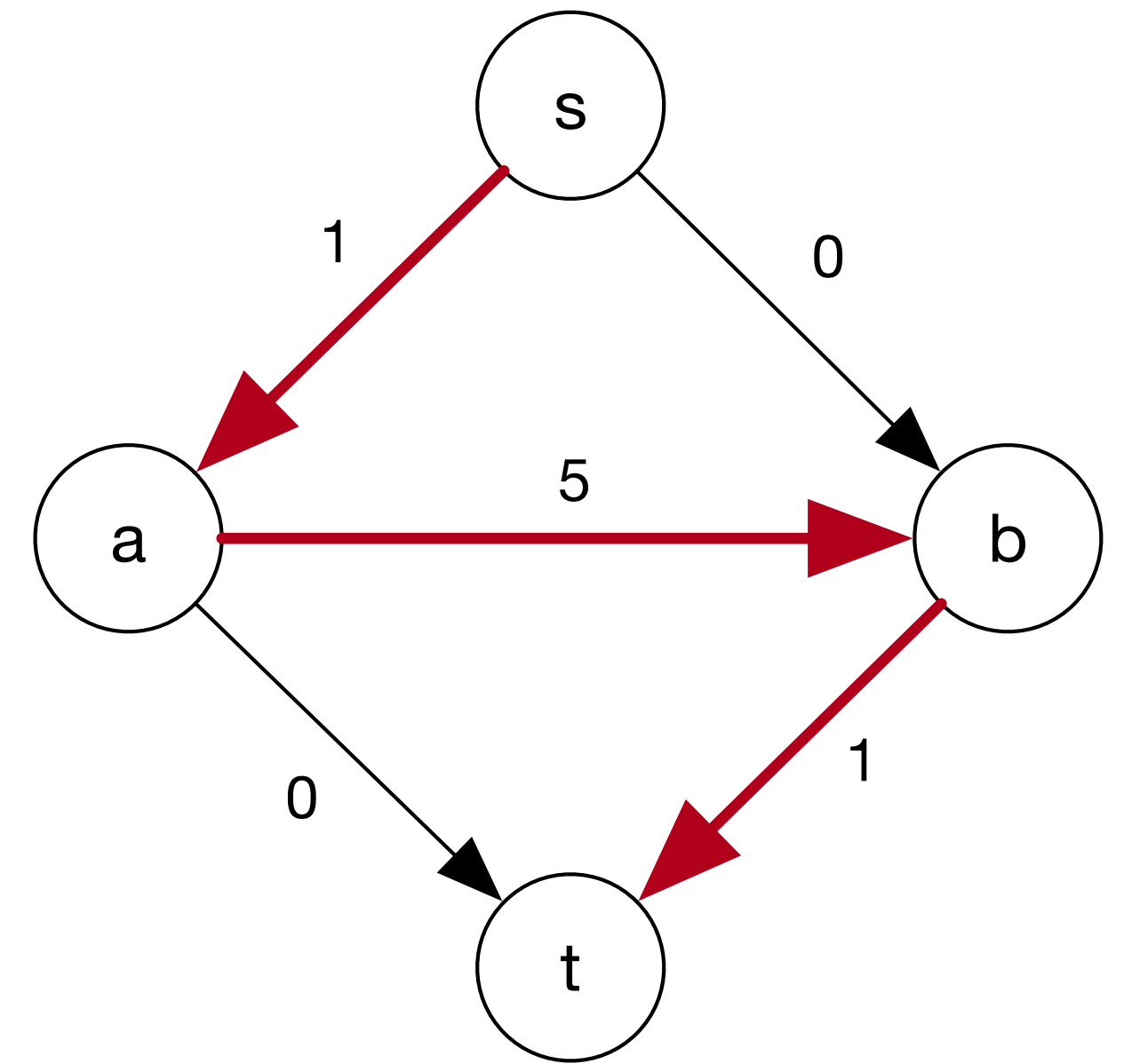
CAPACITY



FLOW



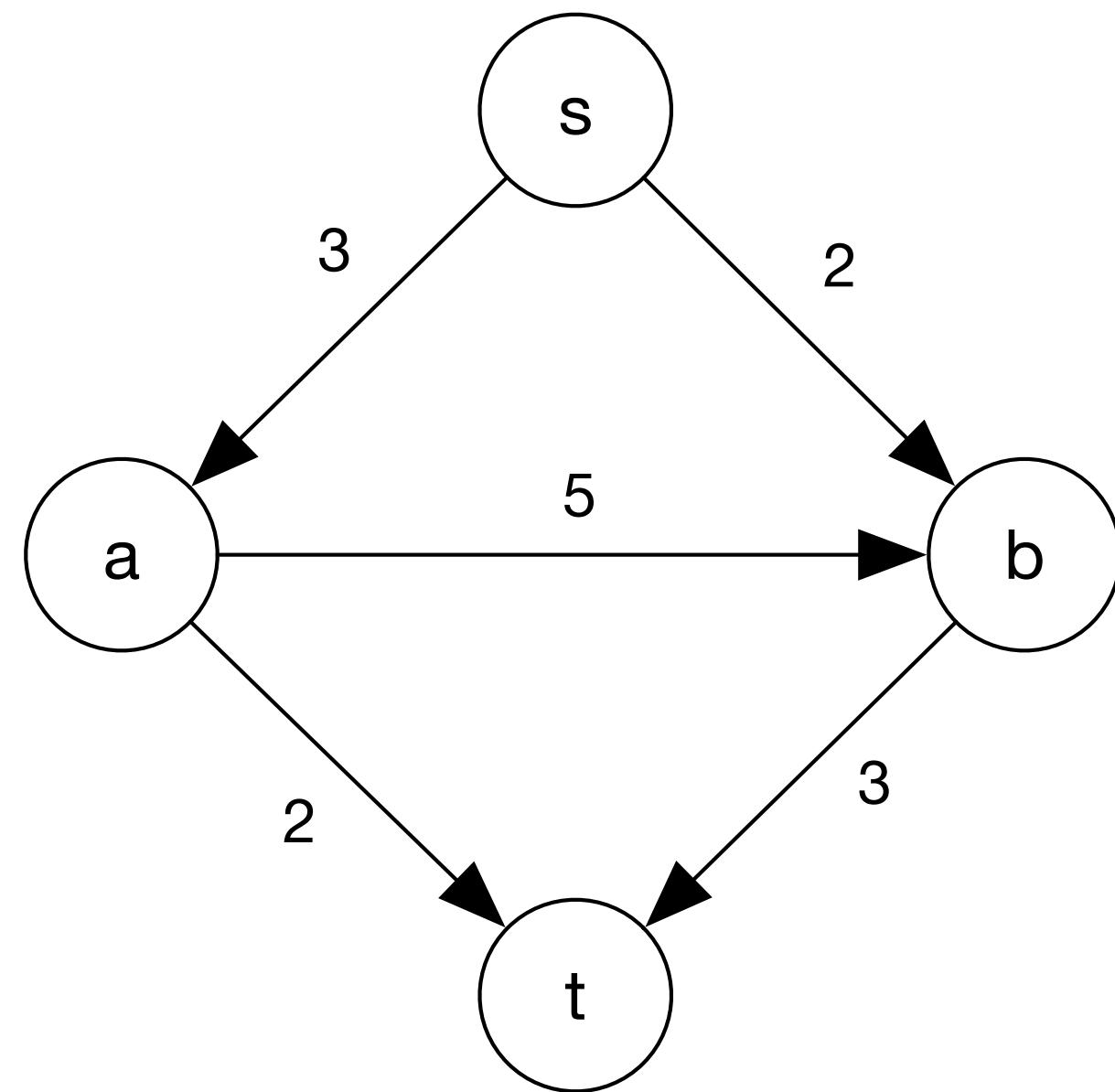
RESIDUAL



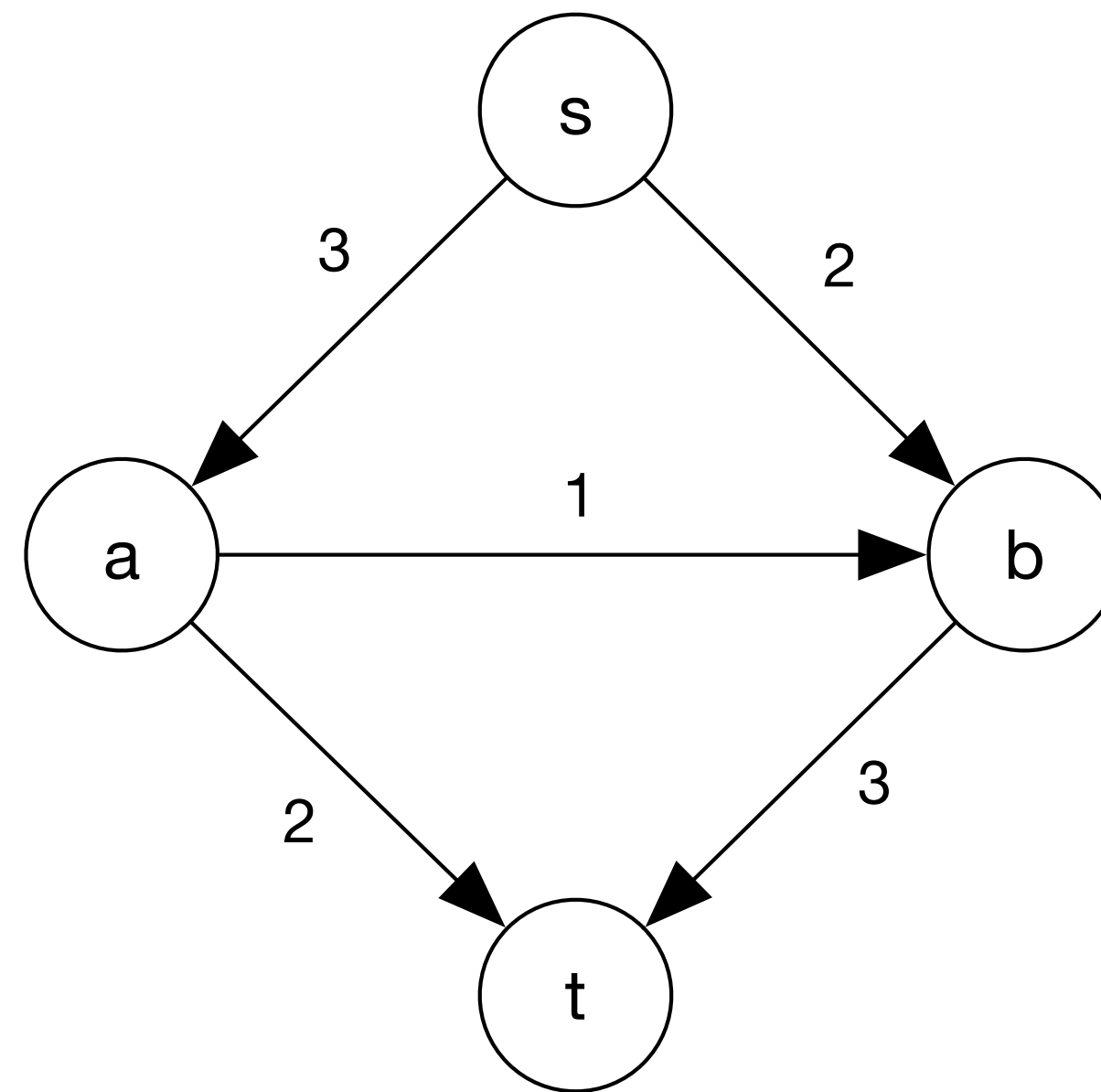


# Network flow

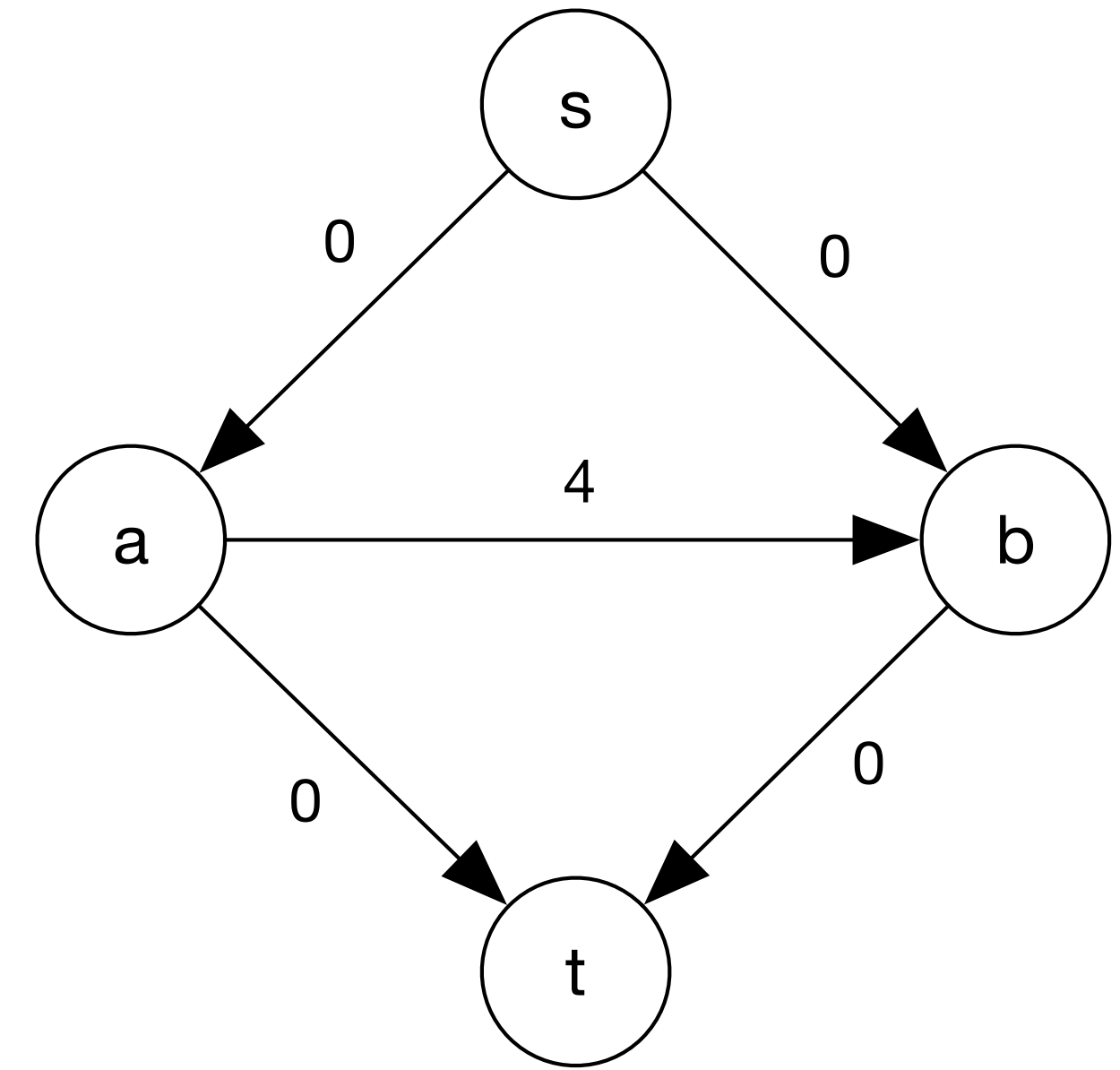
CAPACITY



FLOW



RESIDUAL



Now we have found the maximum flow

# Network flow

*Problem:* By a "bad" sequence of discoveries of augmenting paths, we might discover a "blocking flow" which prevents us from discovering other augmenting paths.

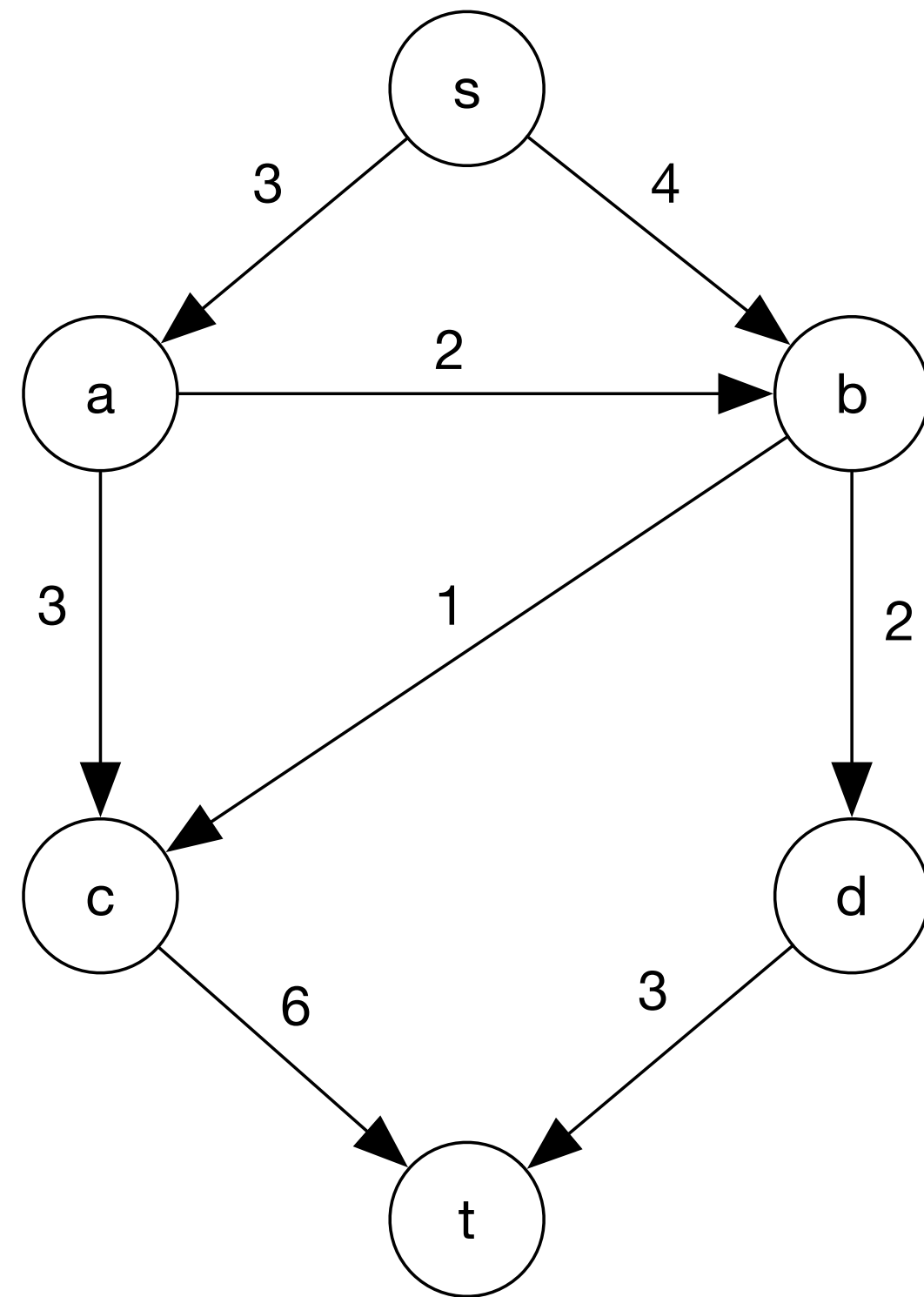
# Network flow

*Problem:* By a "bad" sequence of discoveries of augmenting paths, we might discover a "blocking flow" which prevents us from discovering other augmenting paths.

*Solution:* Encode a way of revising flows in the residual graph: add "backward" edges representing flow, in addition to "forward" edges representing unused capacity.

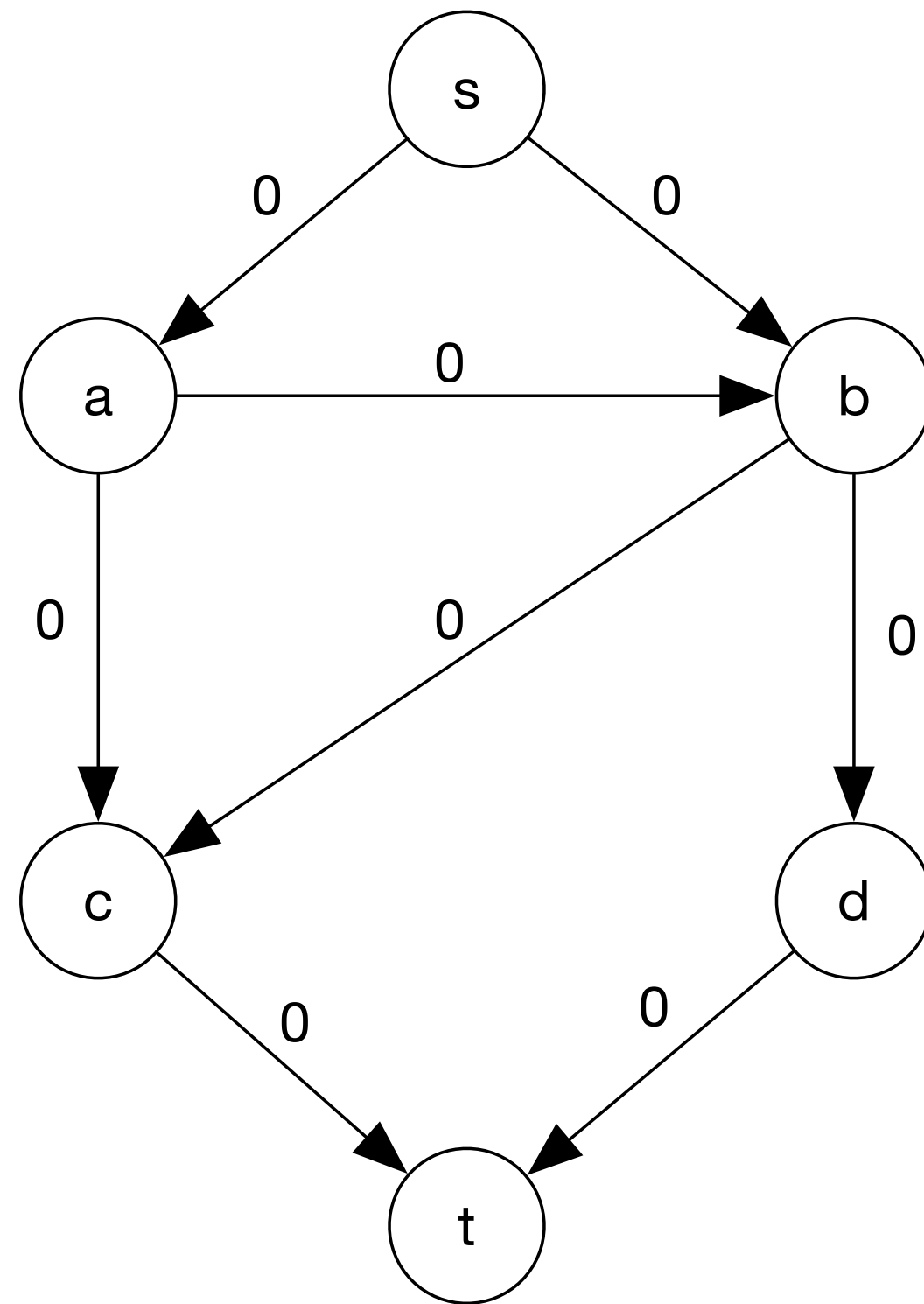
# Network flow

CAPACITY



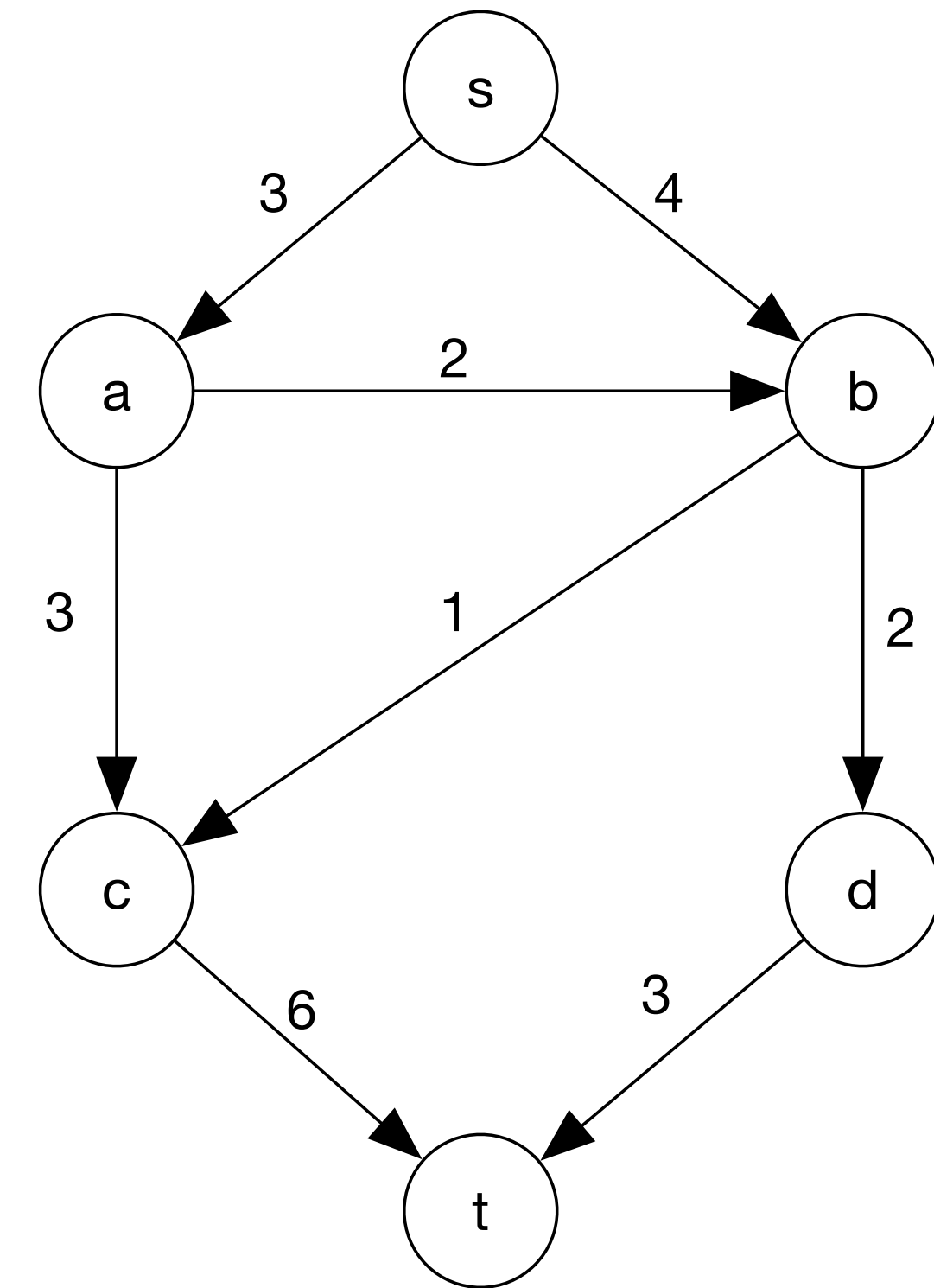
$$C_{u,v}$$

FLOW



$$f_{u,v}$$

RESIDUAL



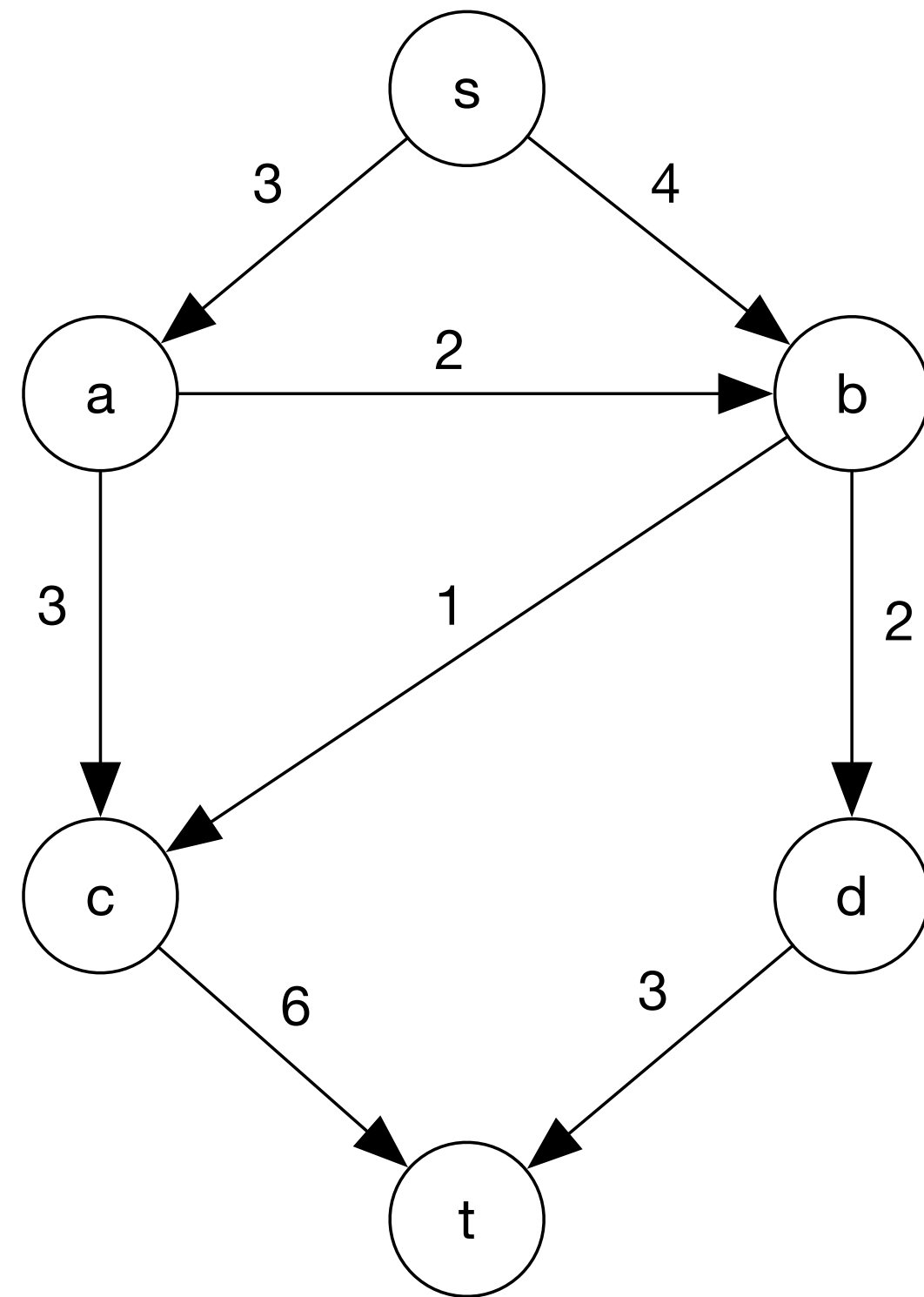
$$C_{u,v} - f_{u,v}$$

# Network flow

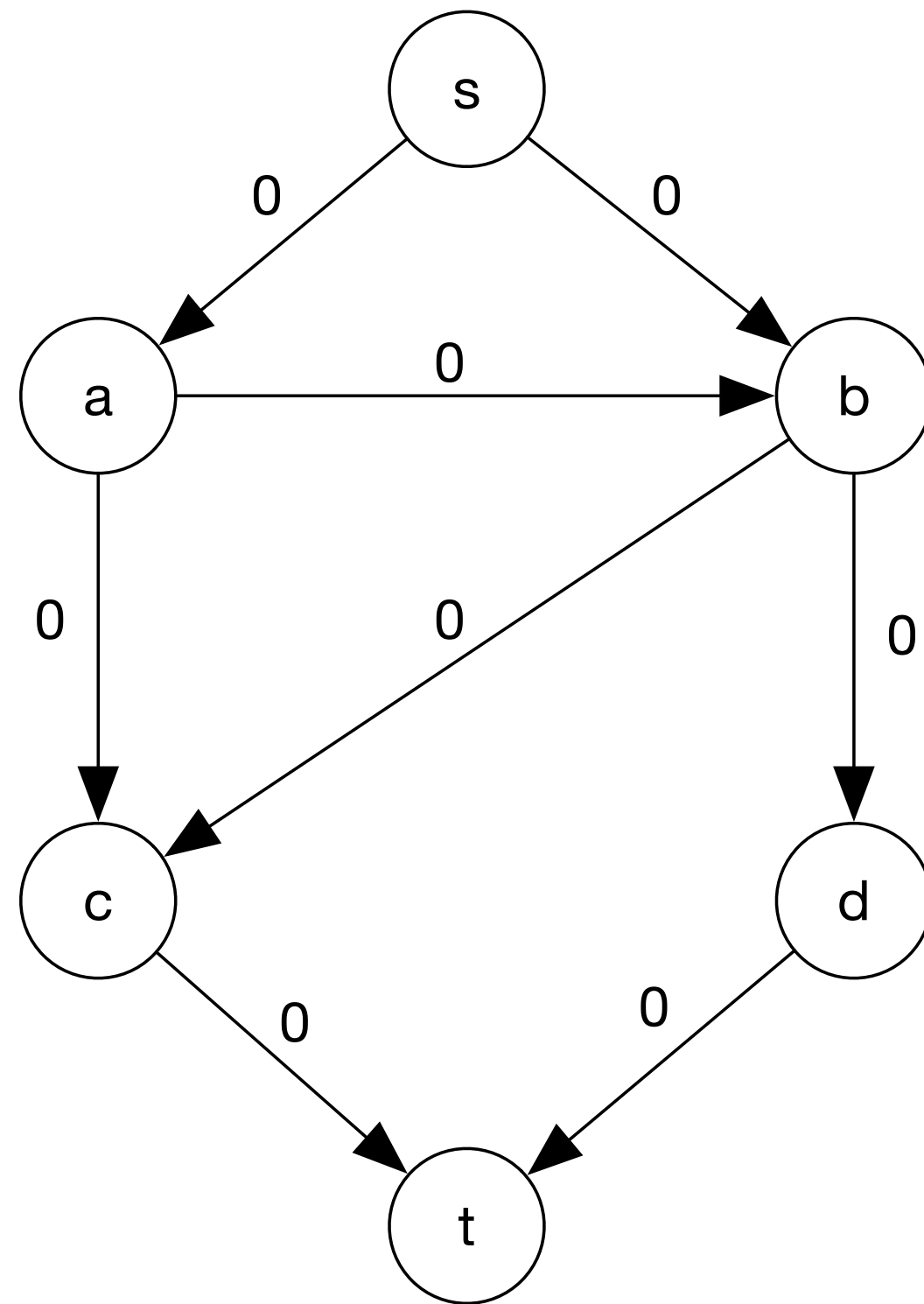
A SERIES OF  
UNFORTUNATE  
EVENTS

# Network flow

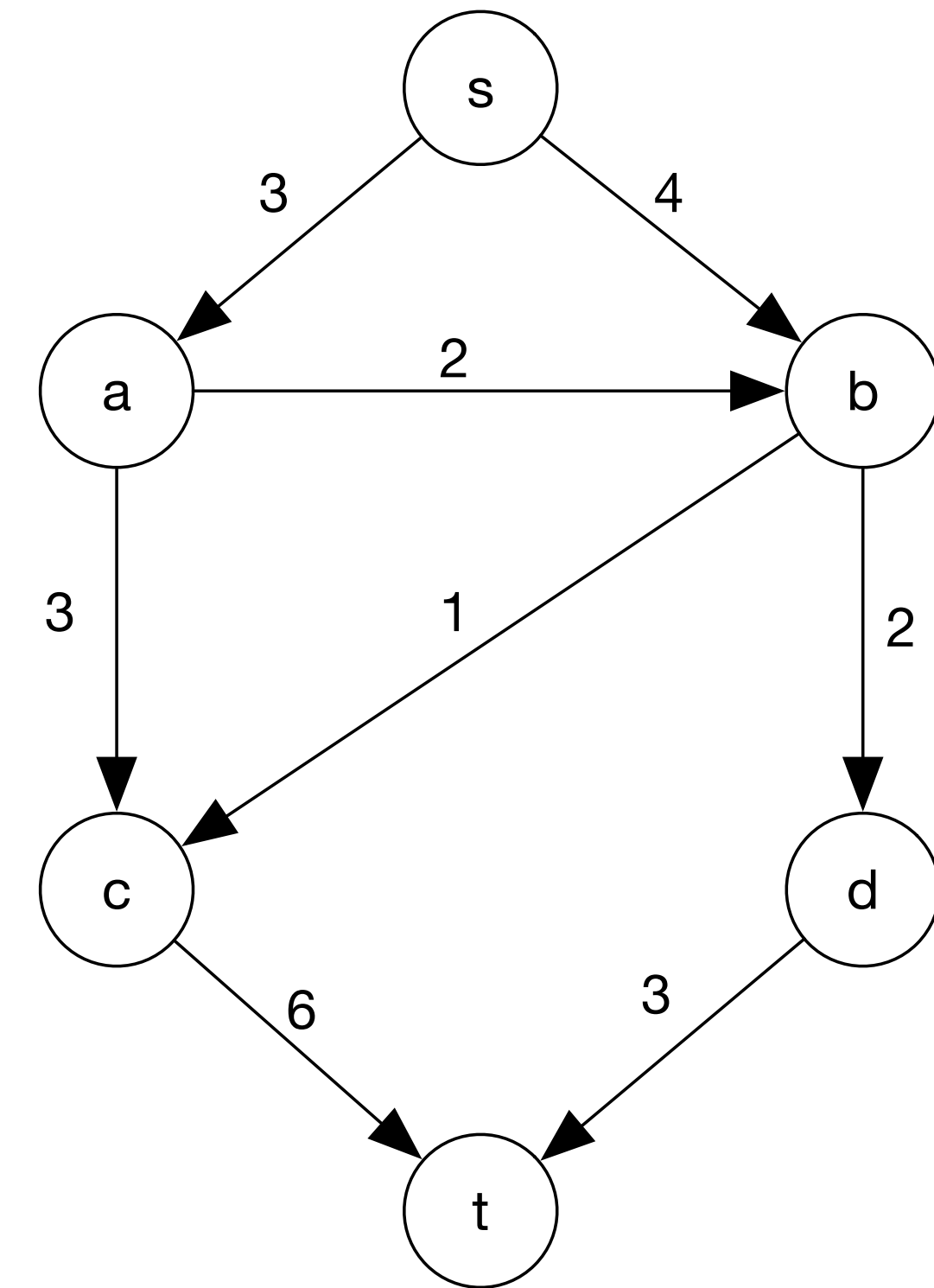
CAPACITY



FLOW

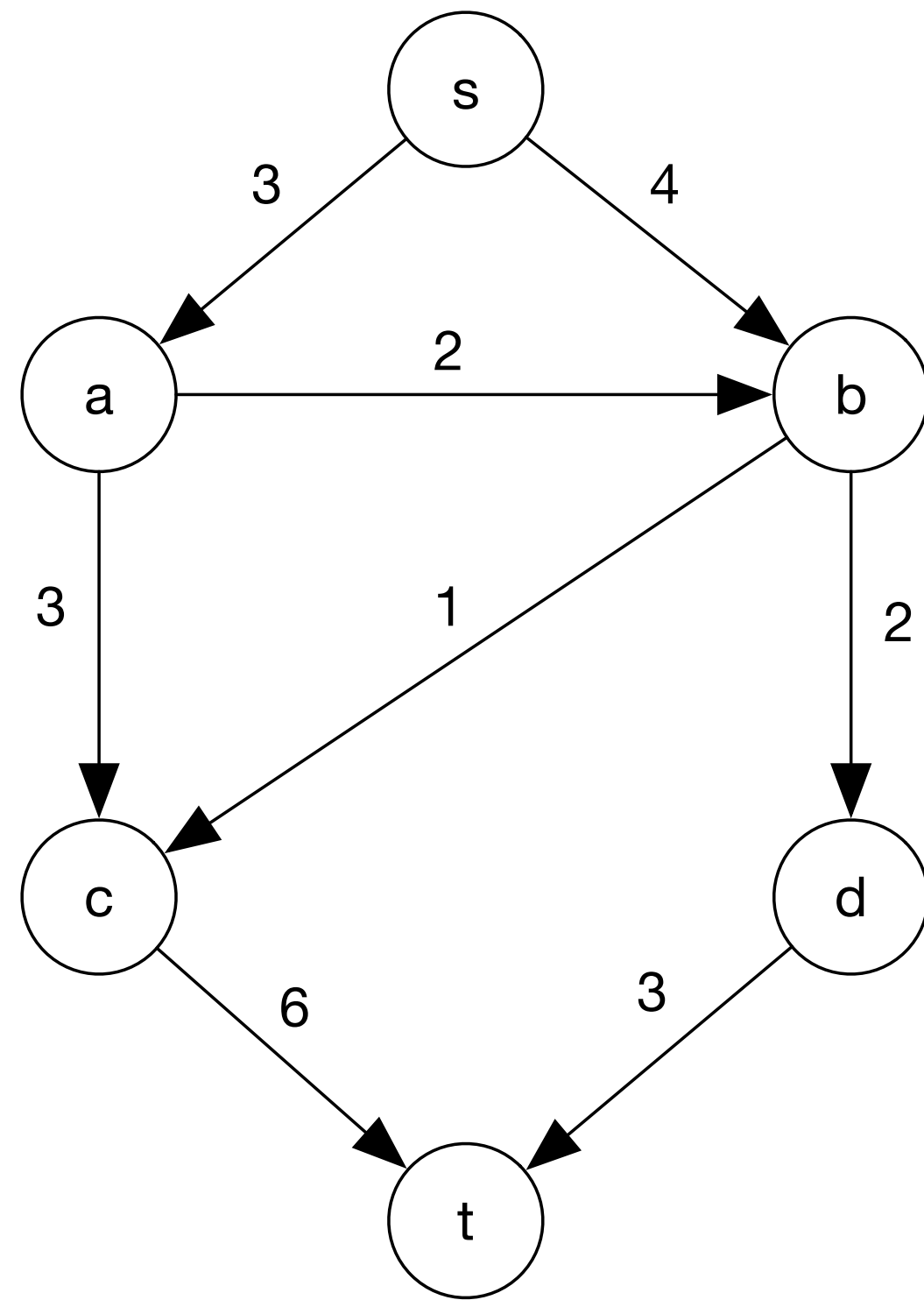


RESIDUAL

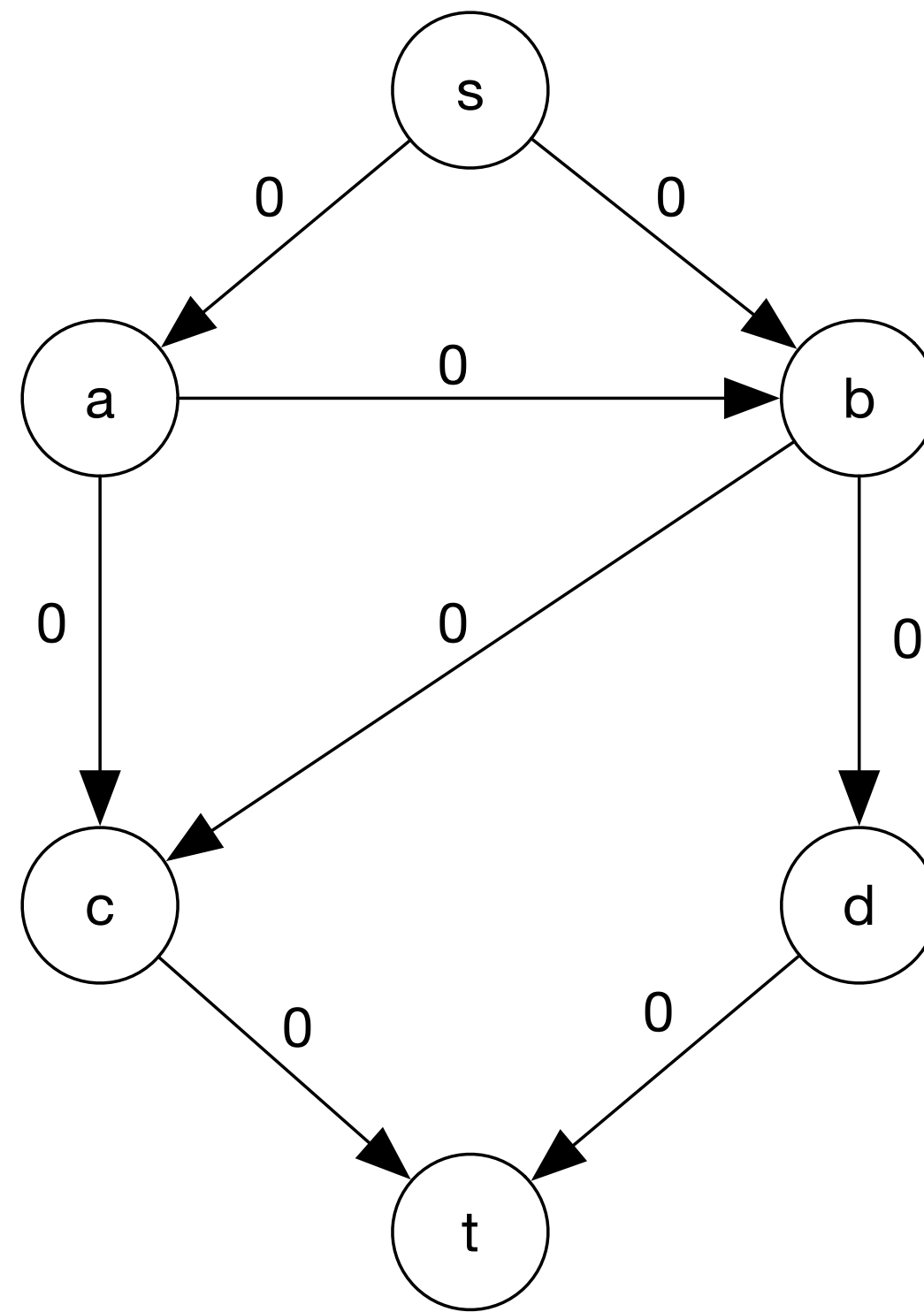


# Network flow

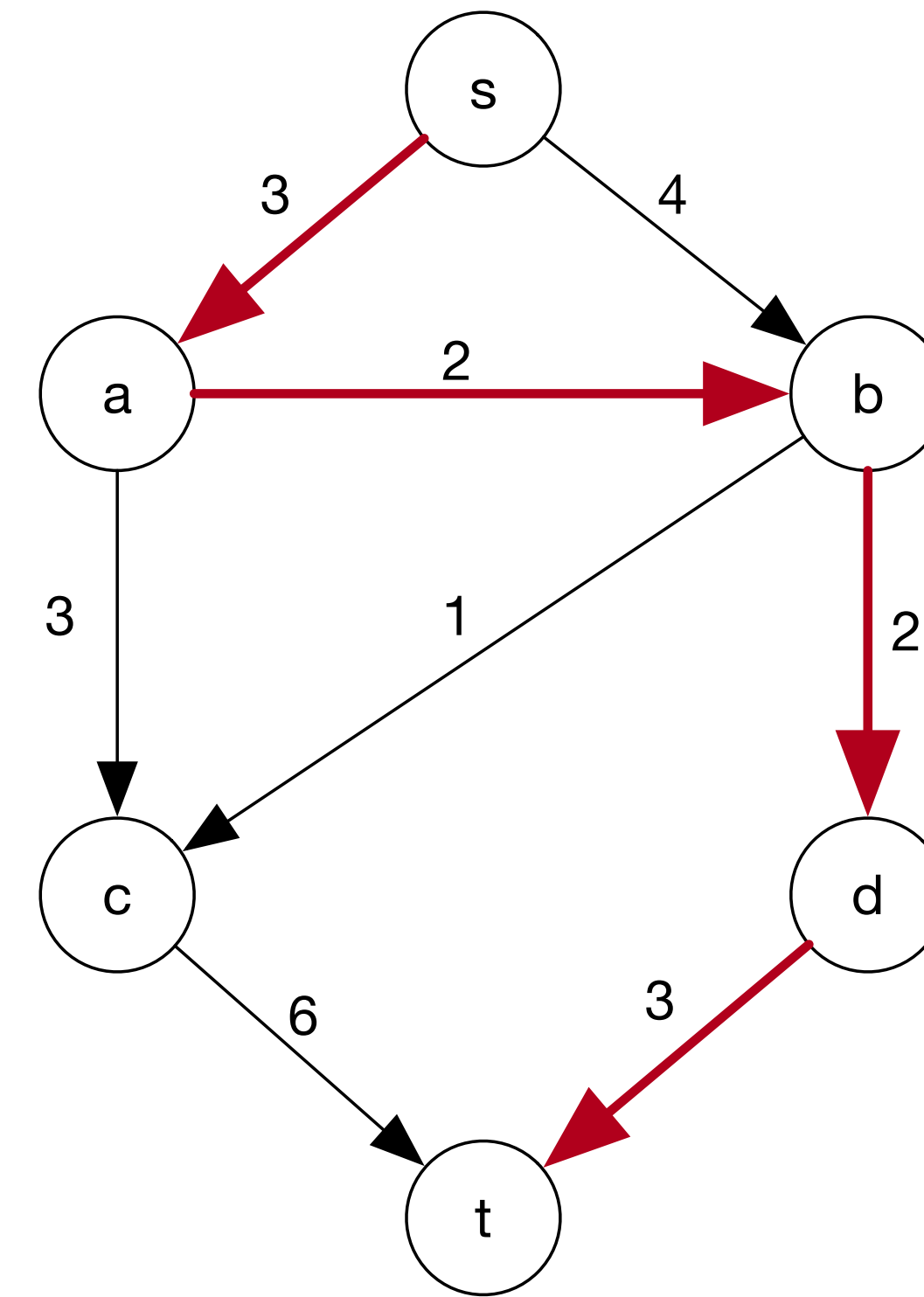
CAPACITY



FLOW

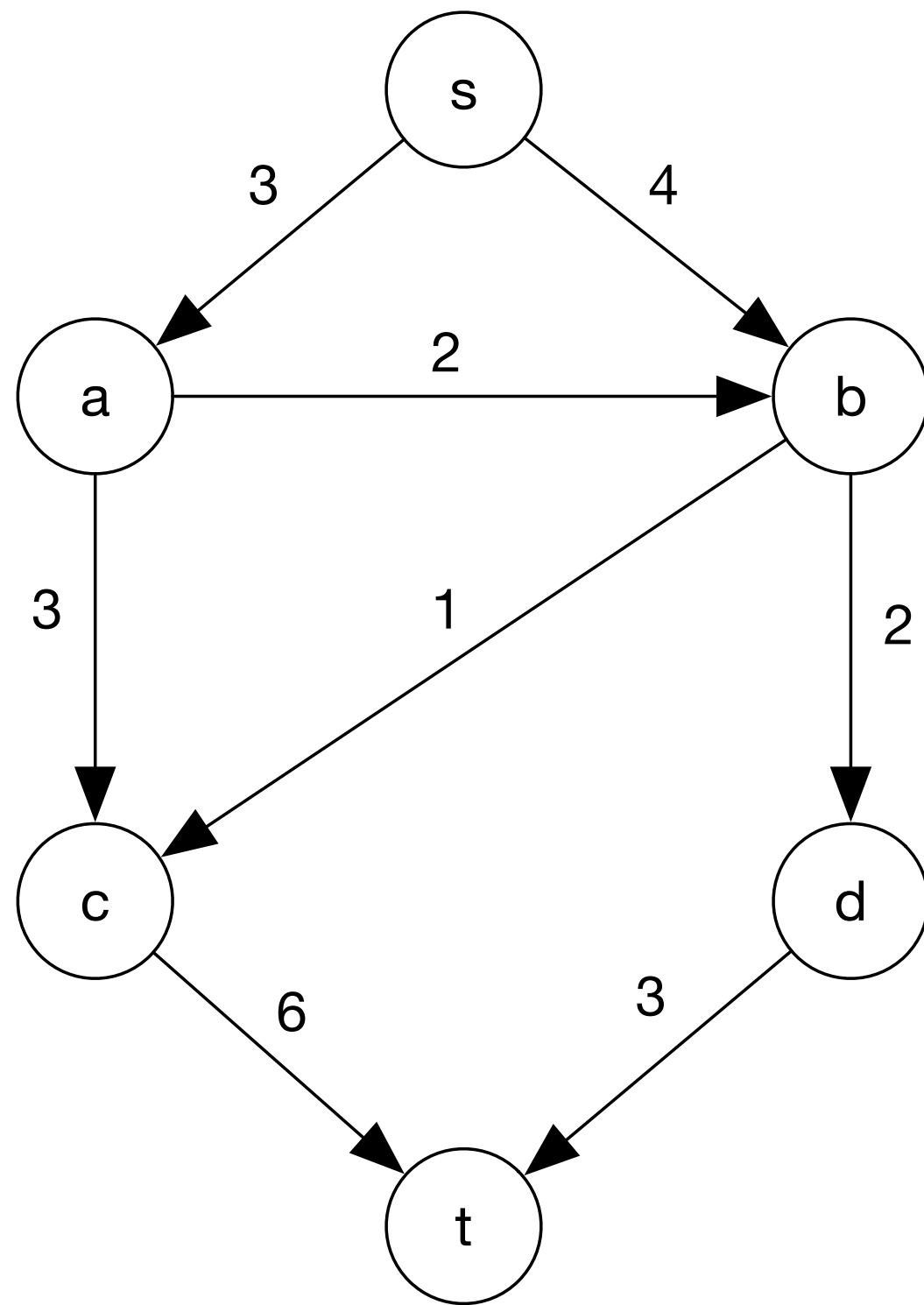


RESIDUAL

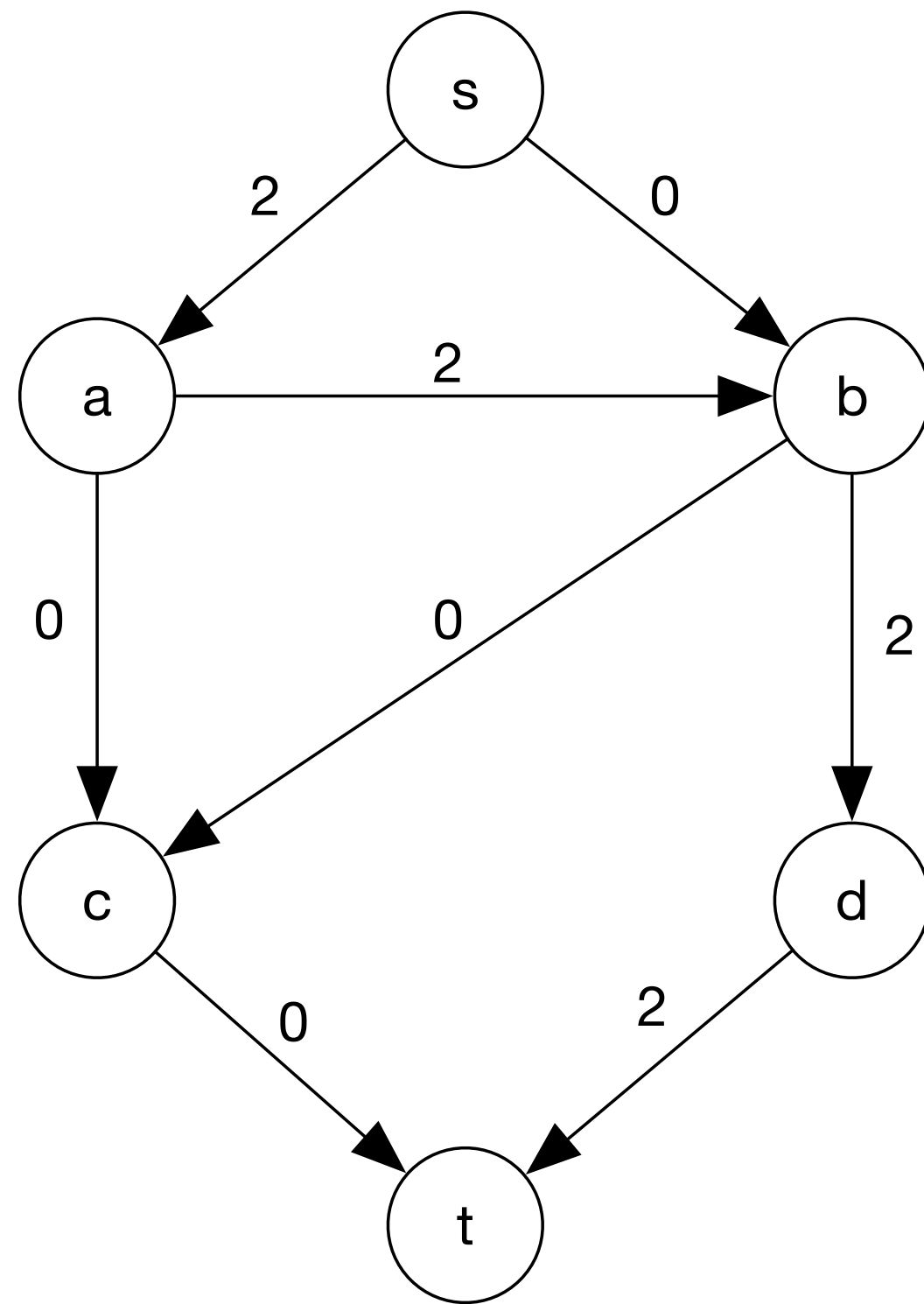


# Network flow

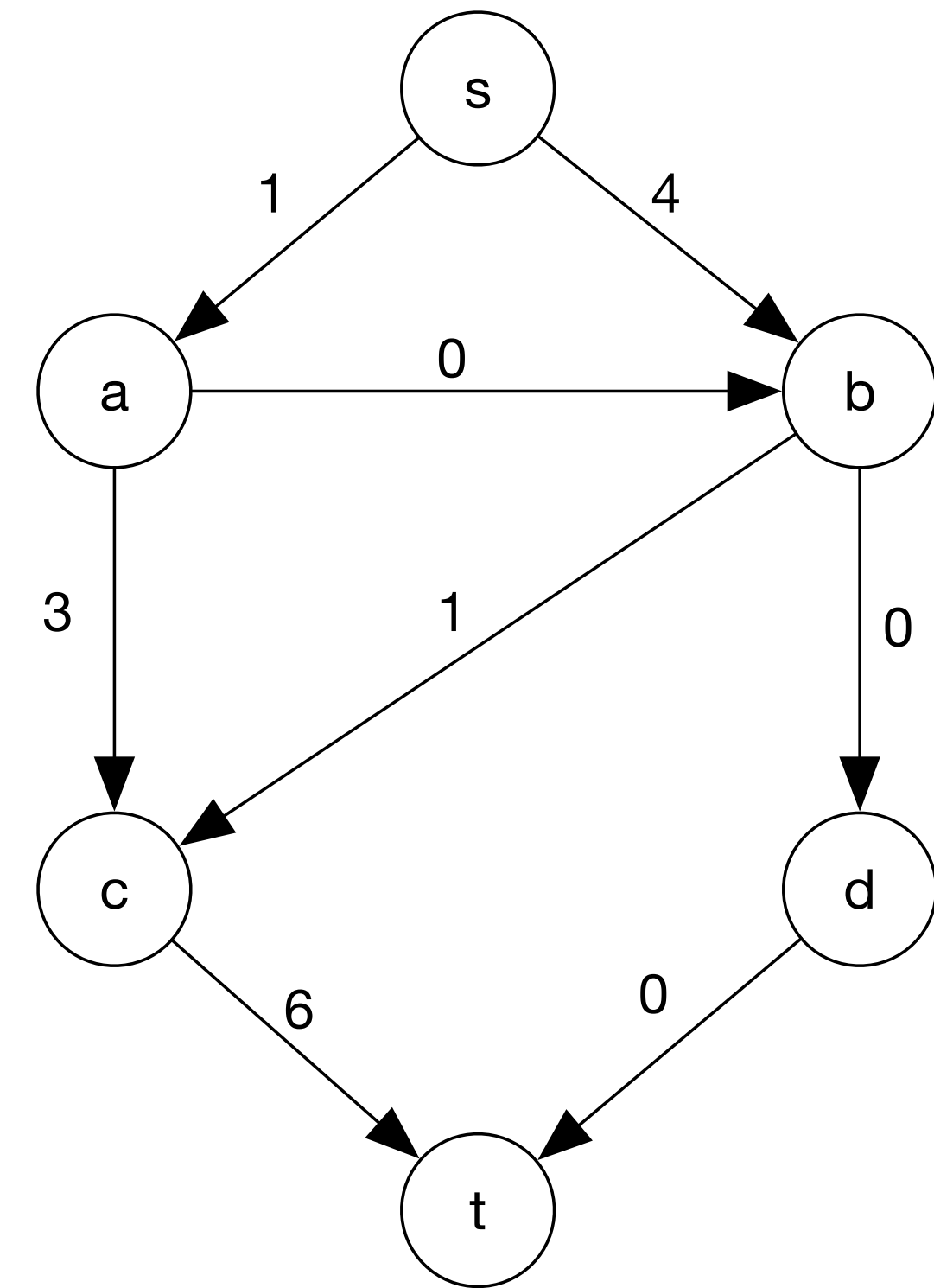
CAPACITY



FLOW



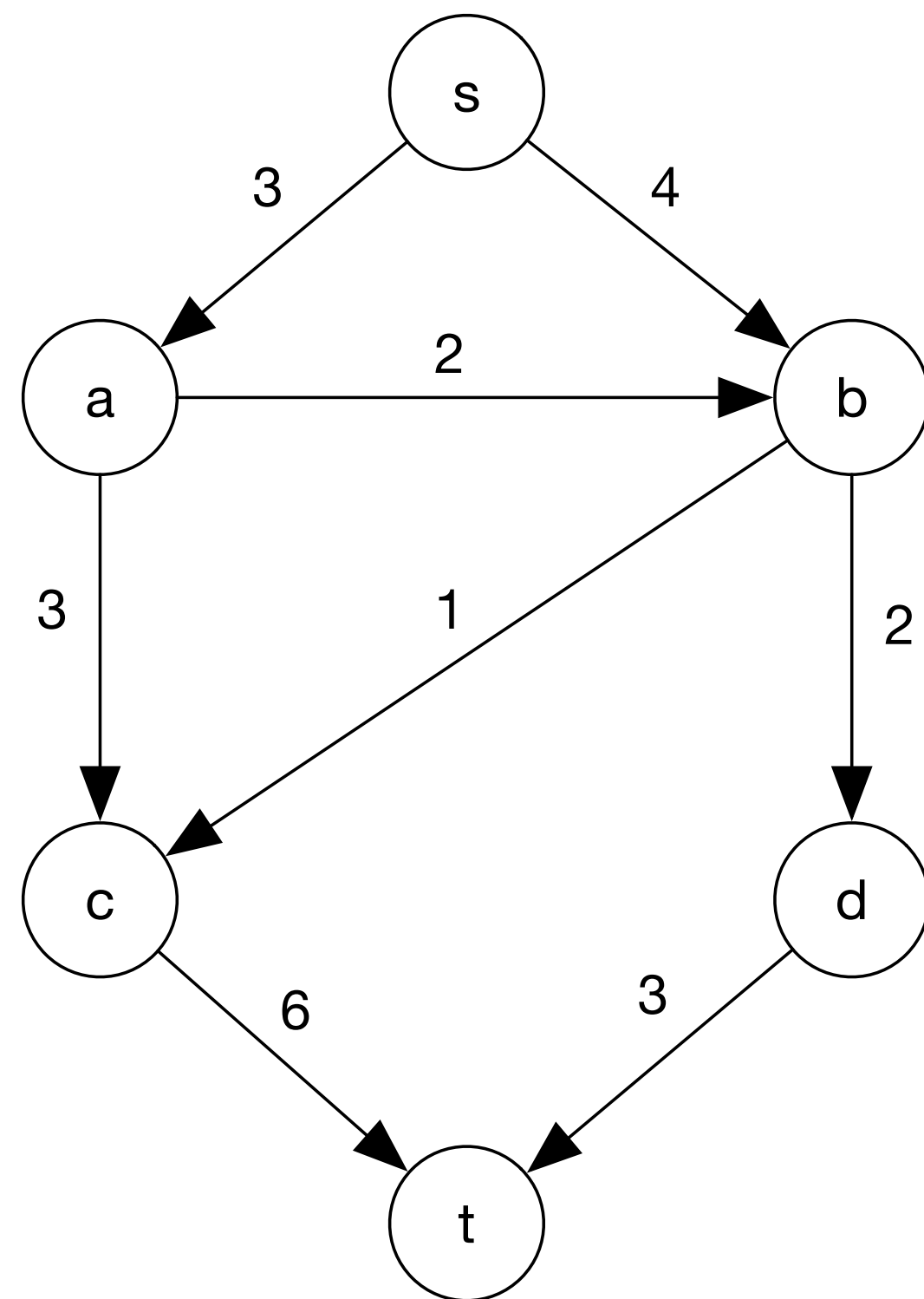
RESIDUAL



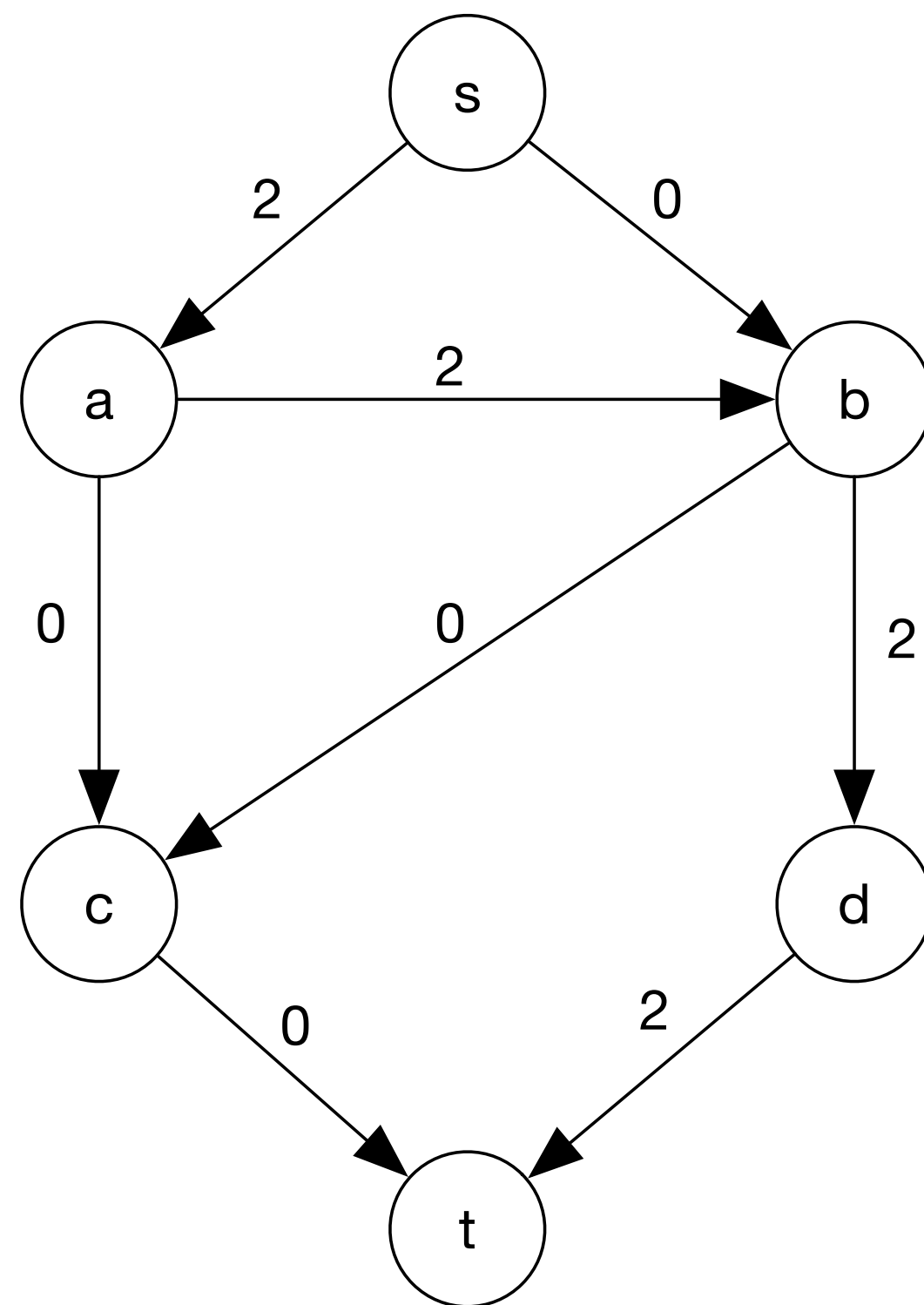


# Network flow

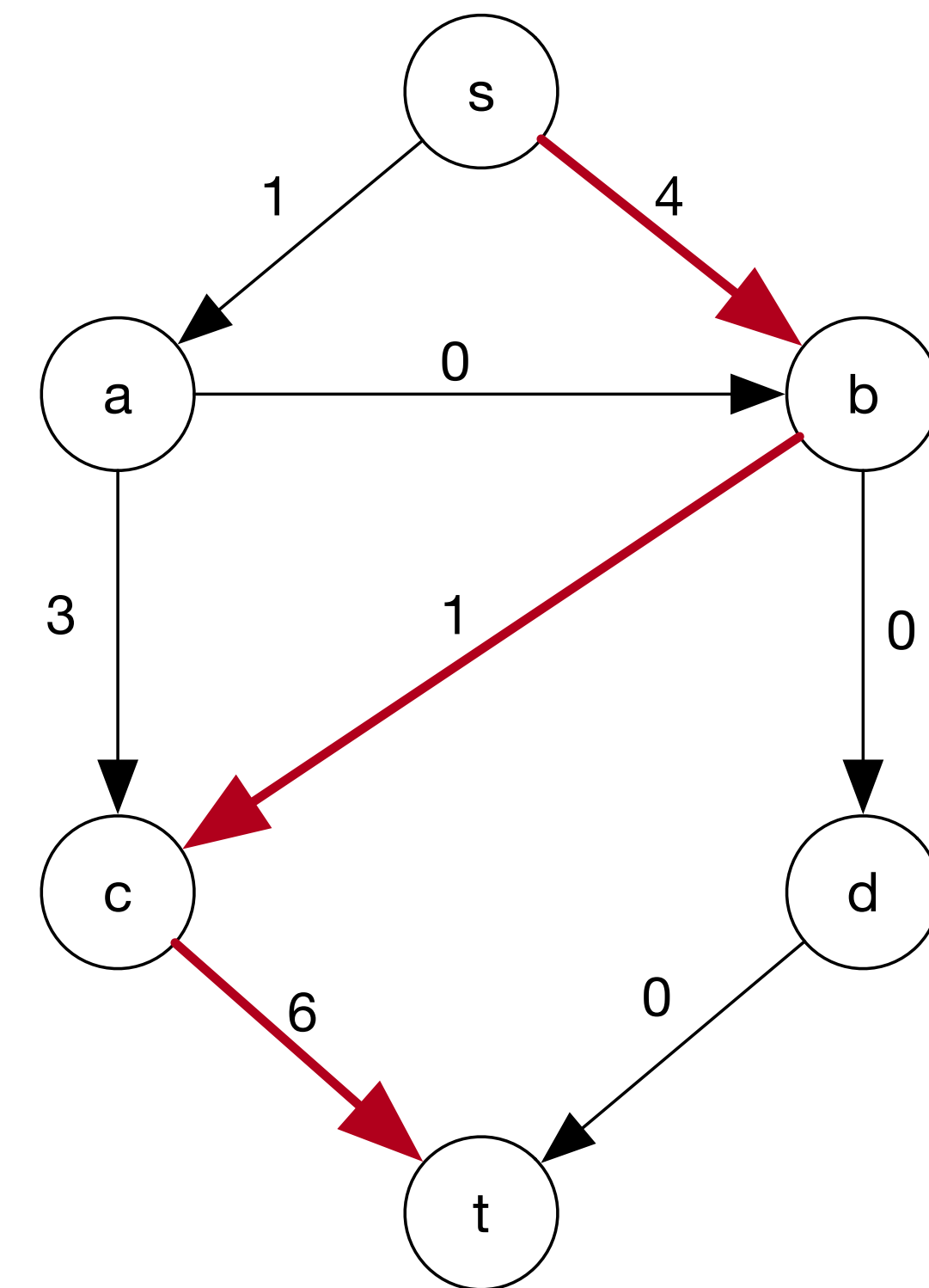
CAPACITY



FLOW

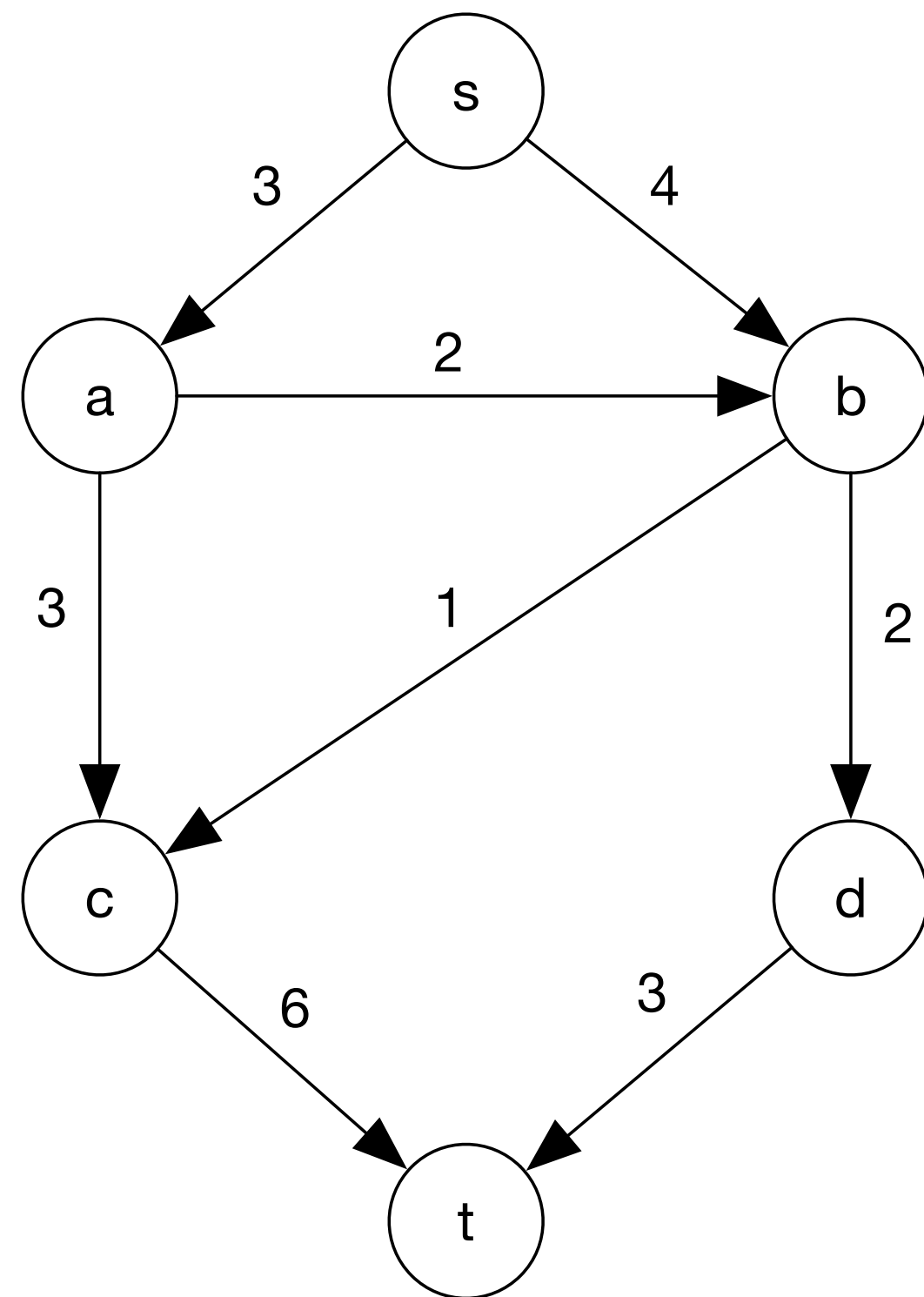


RESIDUAL

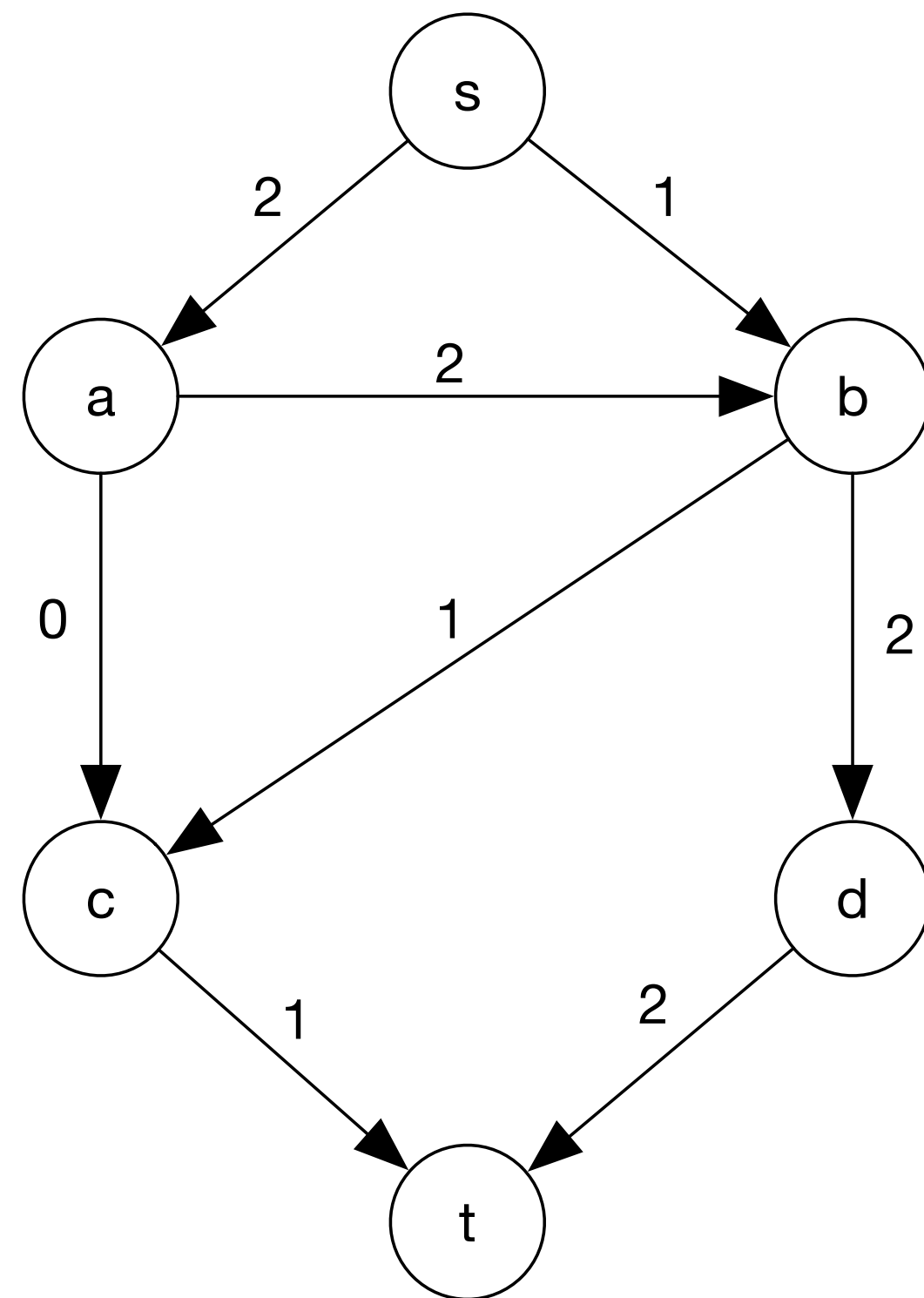


# Network flow

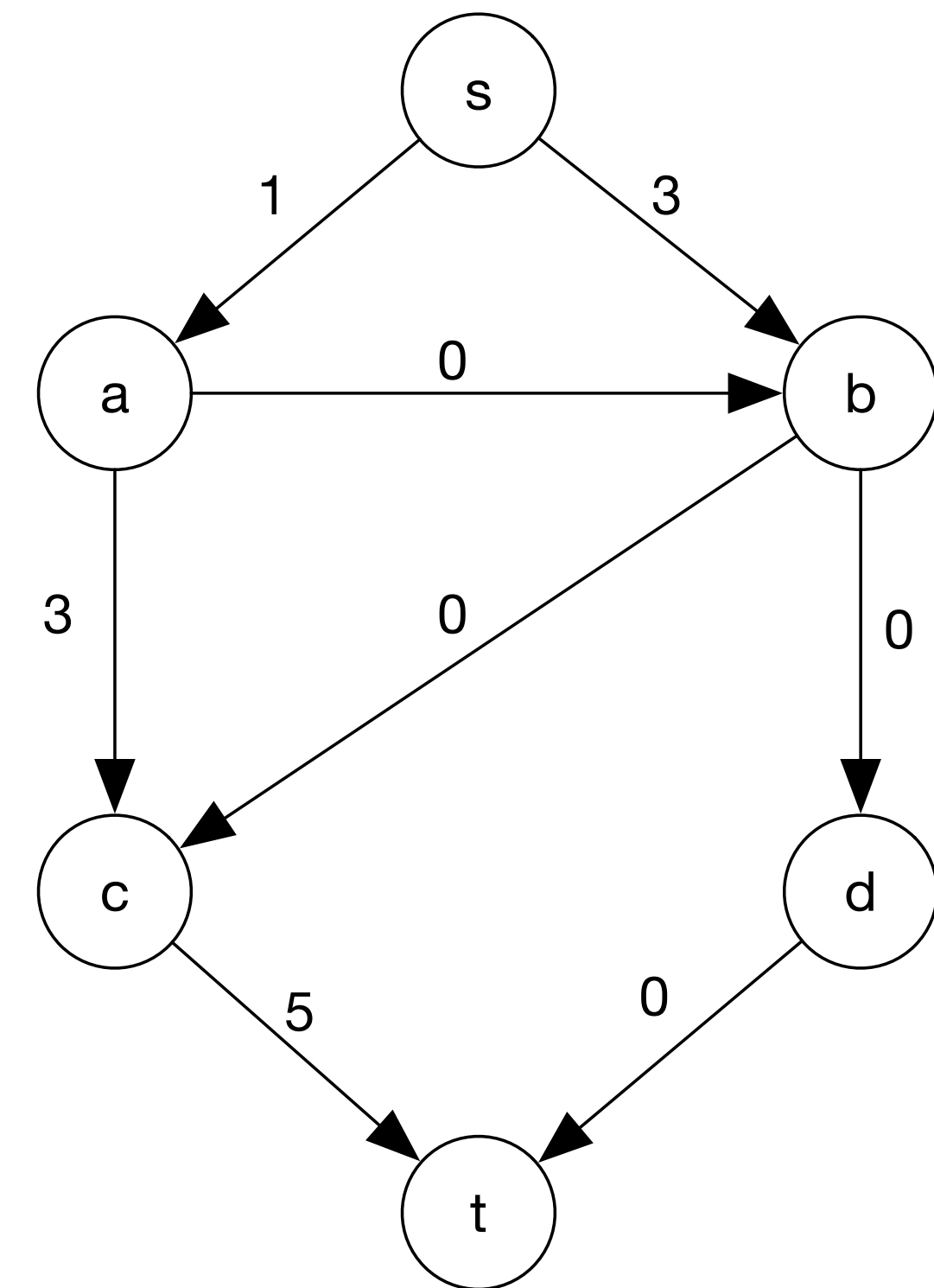
CAPACITY



FLOW

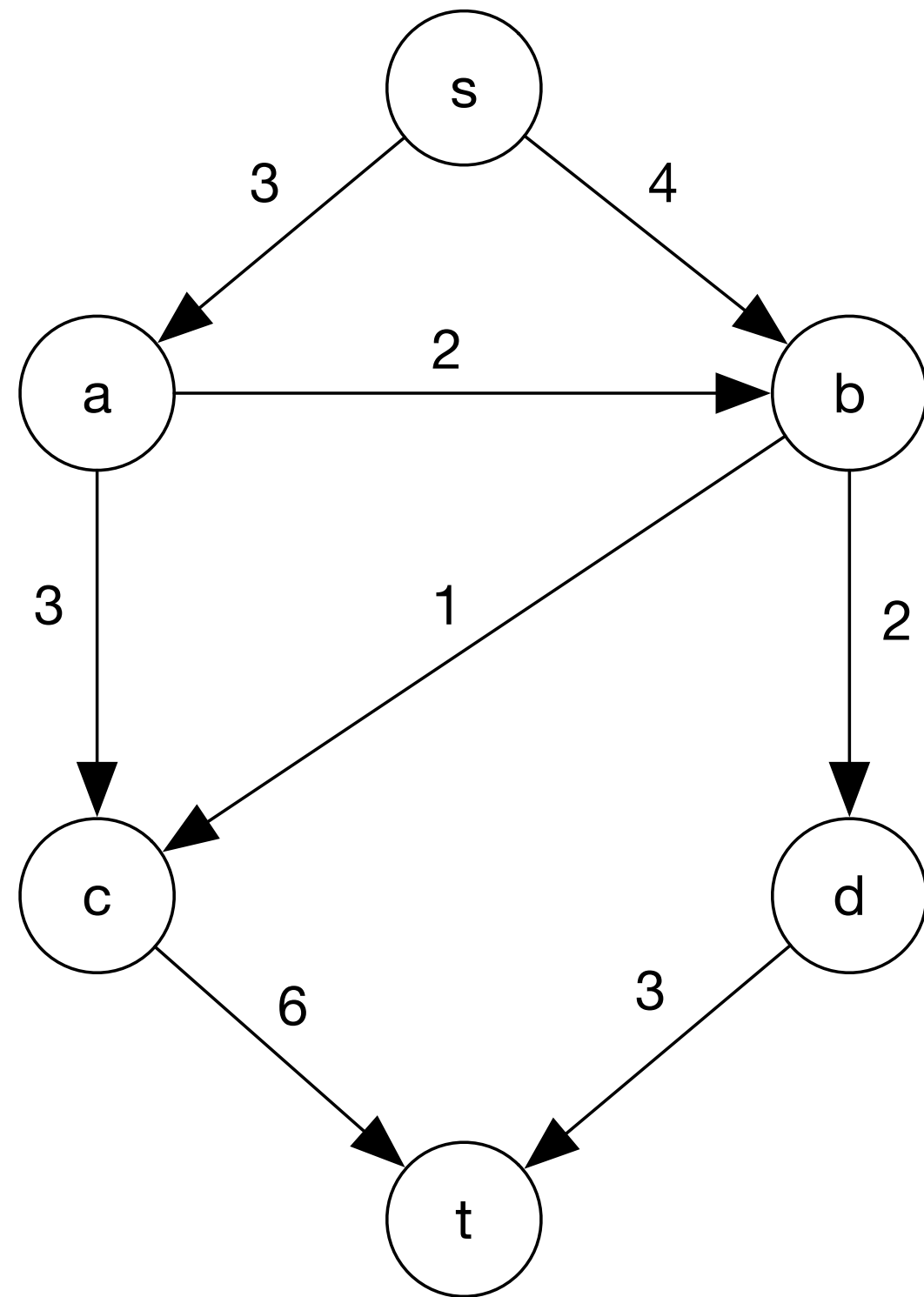


RESIDUAL

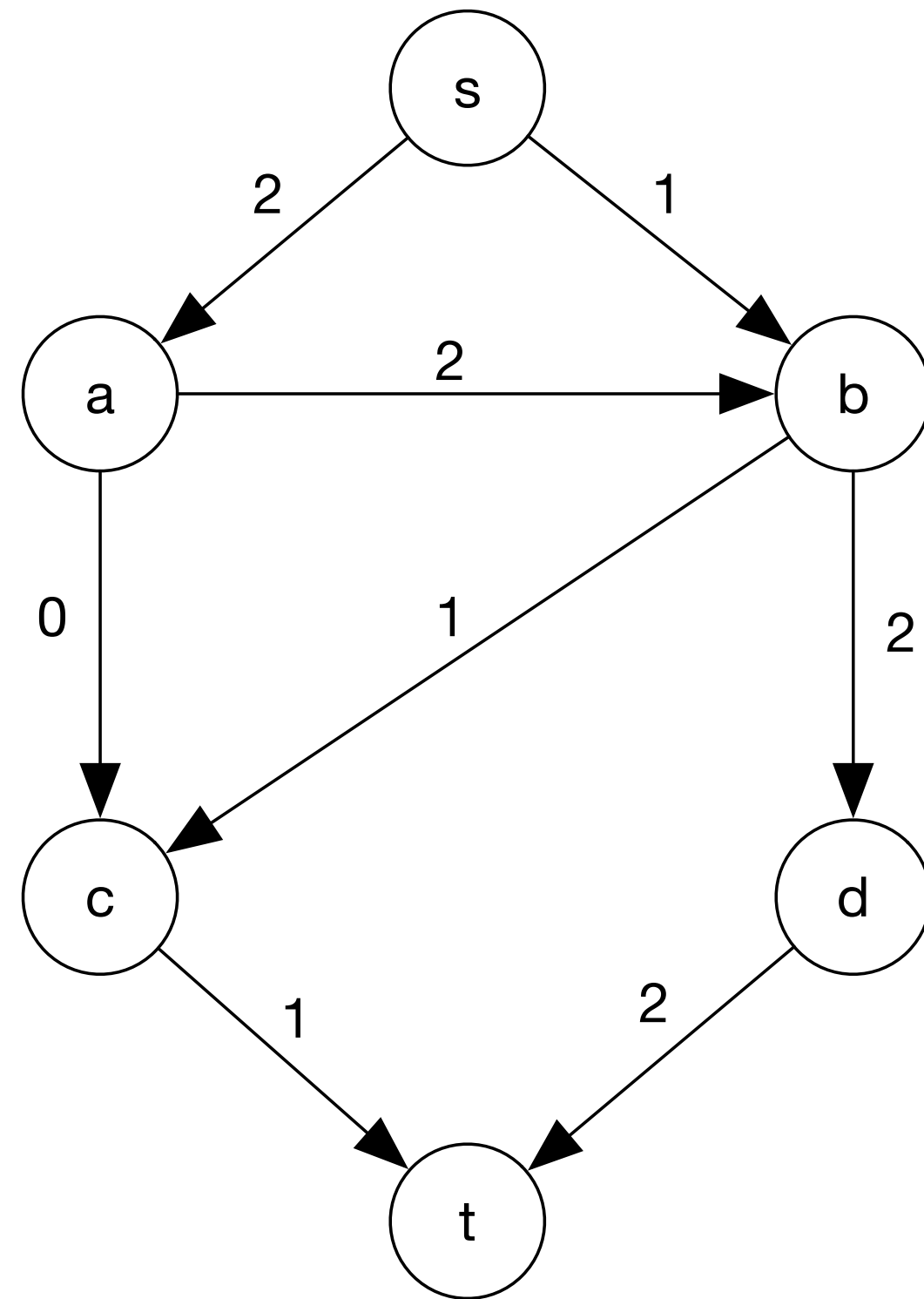


# Network flow

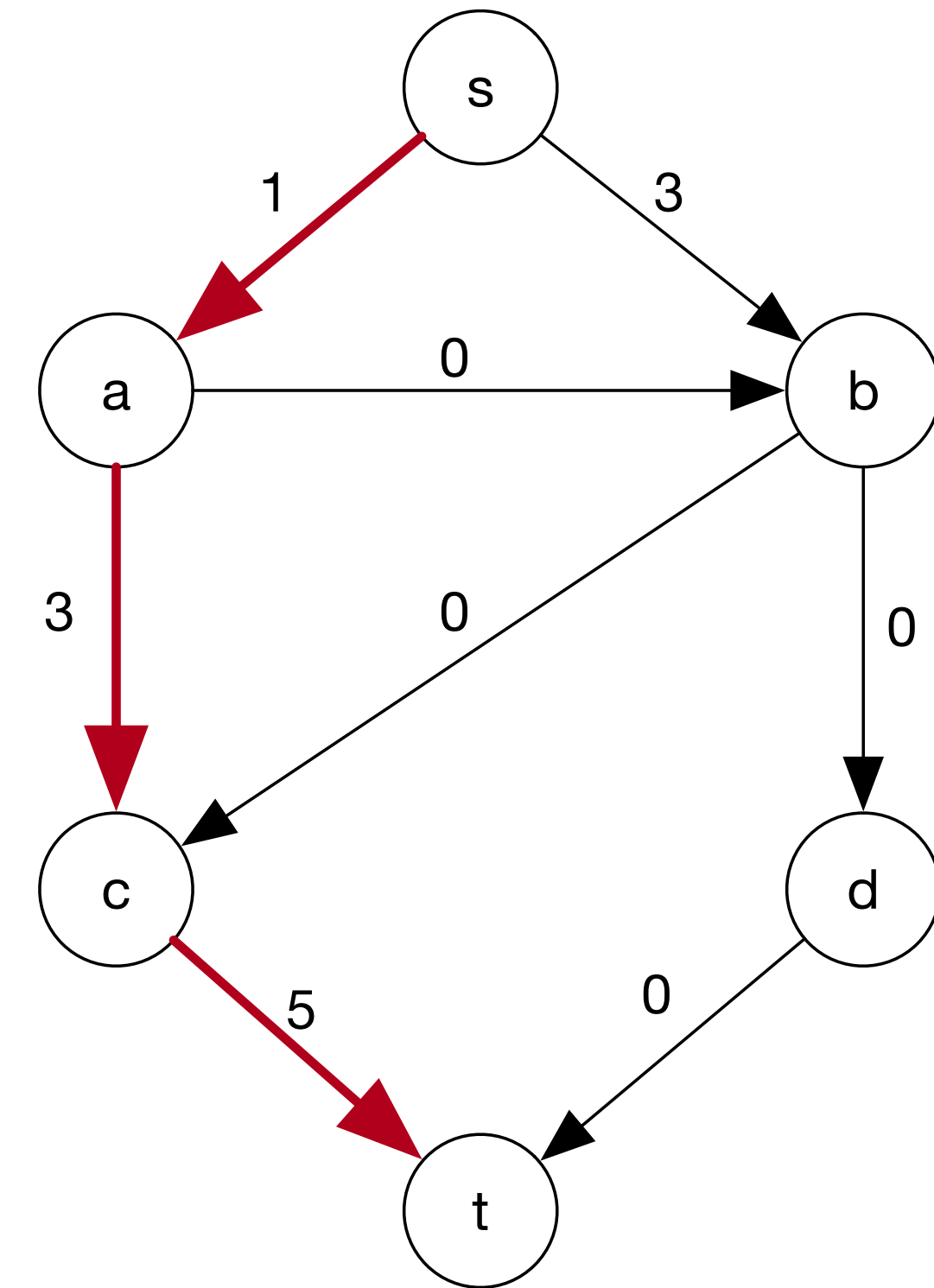
CAPACITY



FLOW

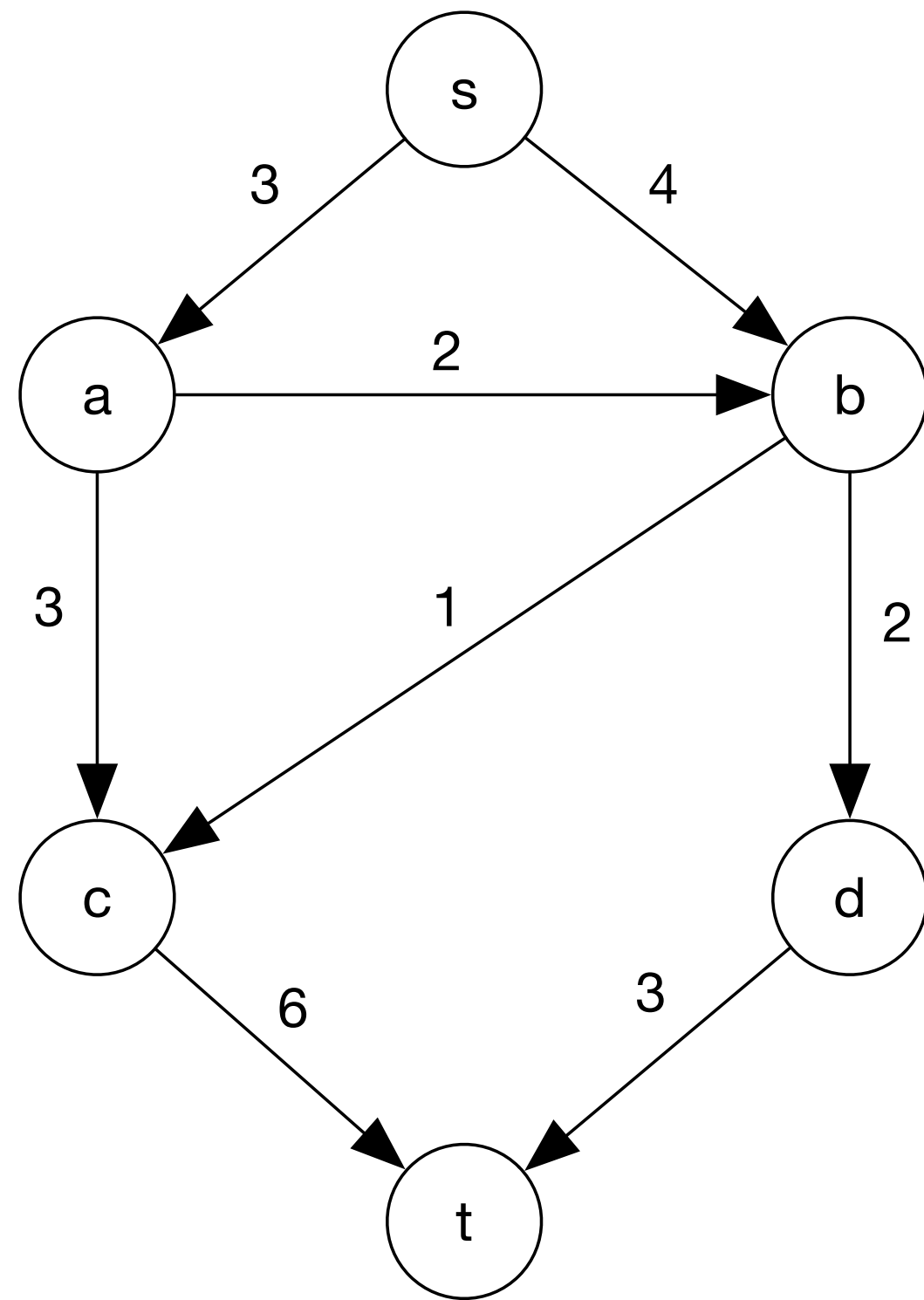


RESIDUAL

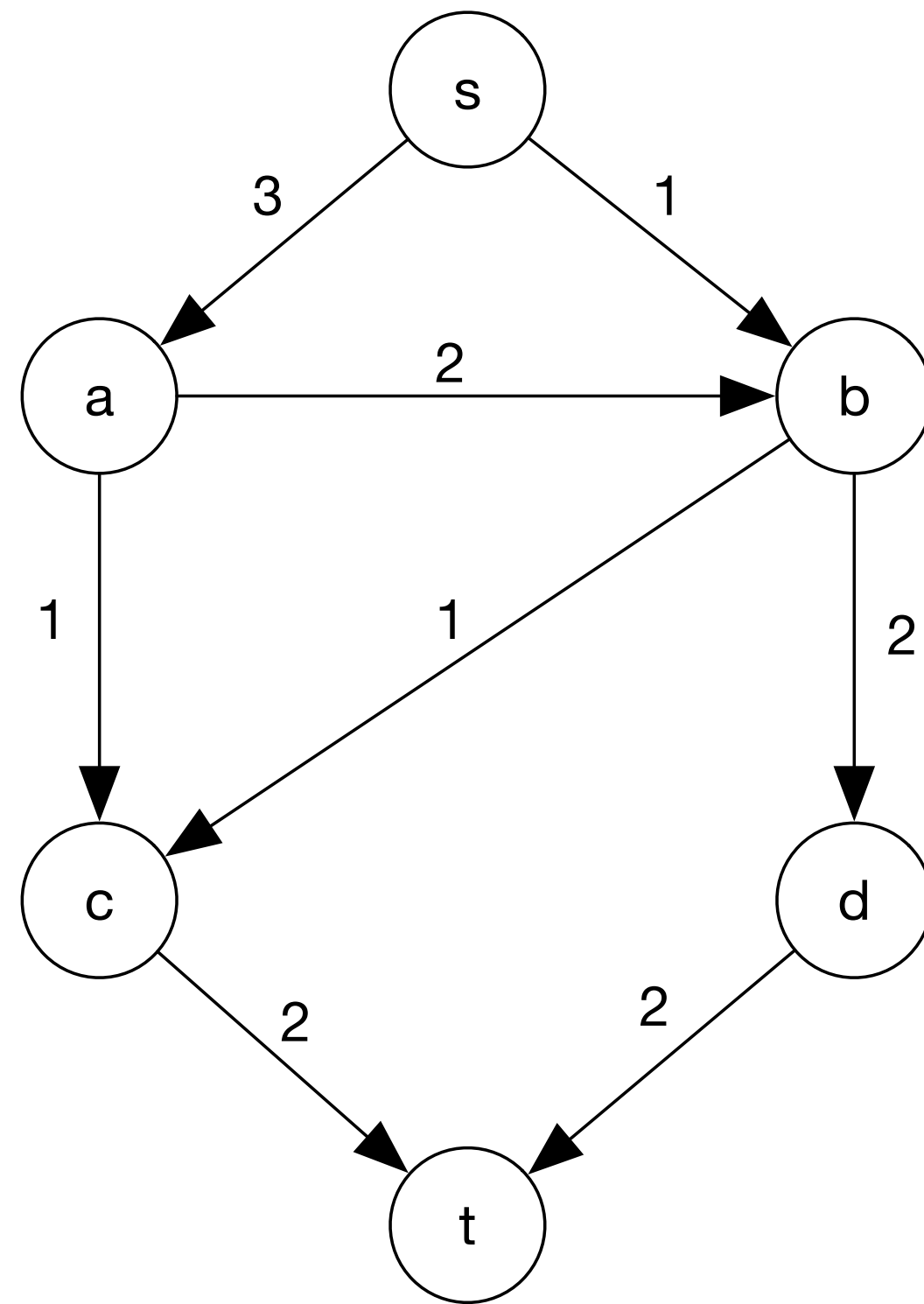


# Network flow

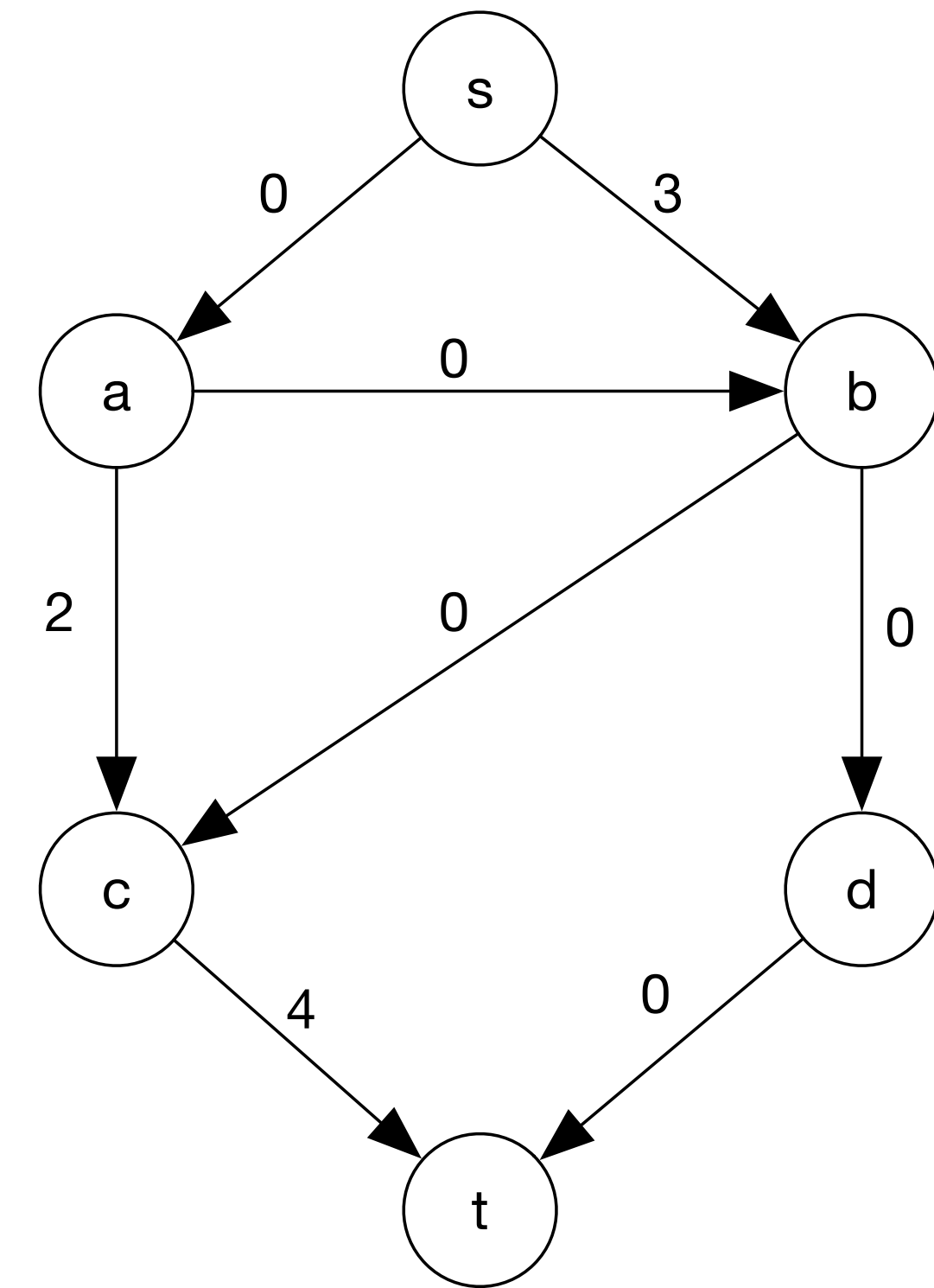
CAPACITY



FLOW



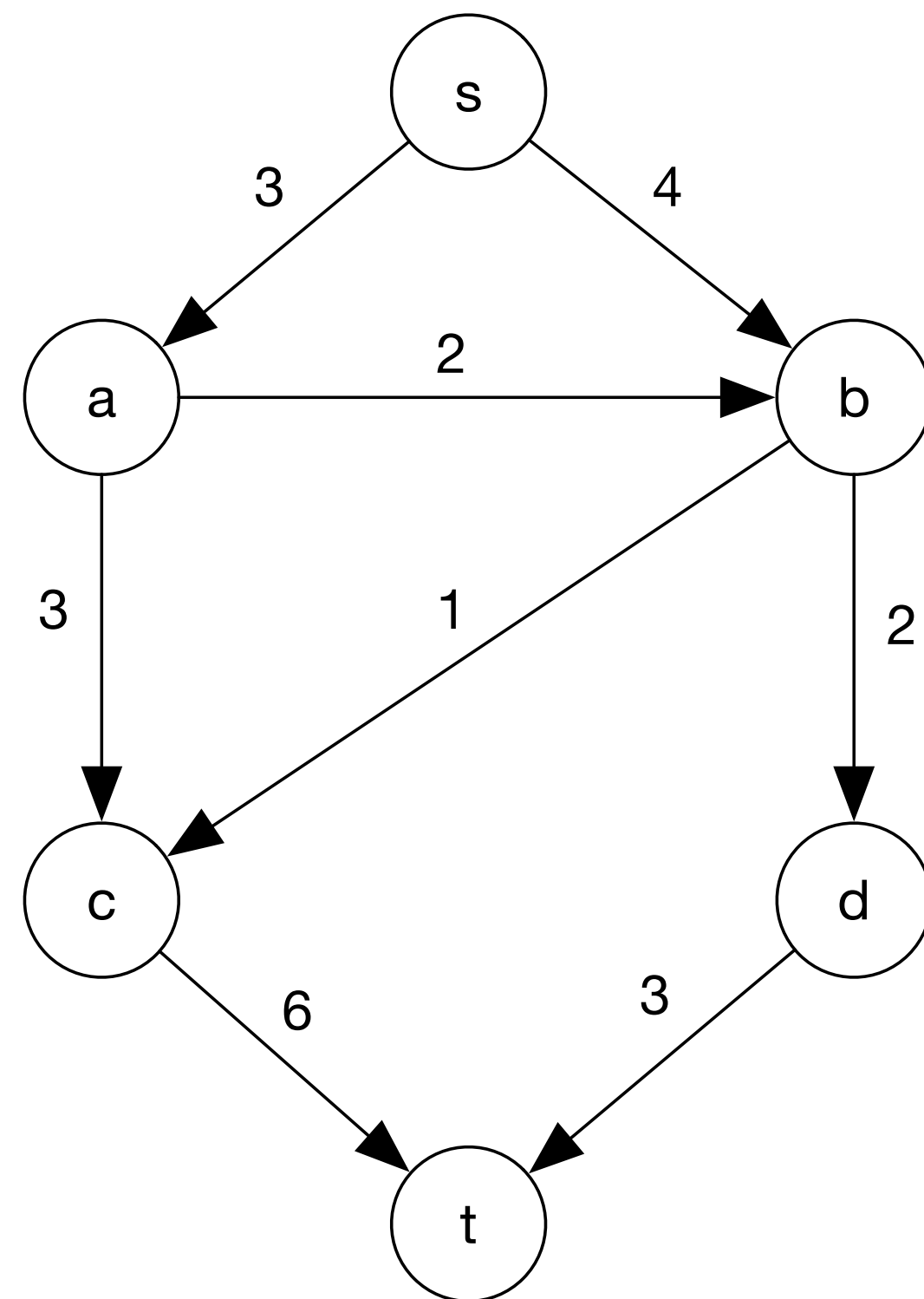
RESIDUAL



# Network flow

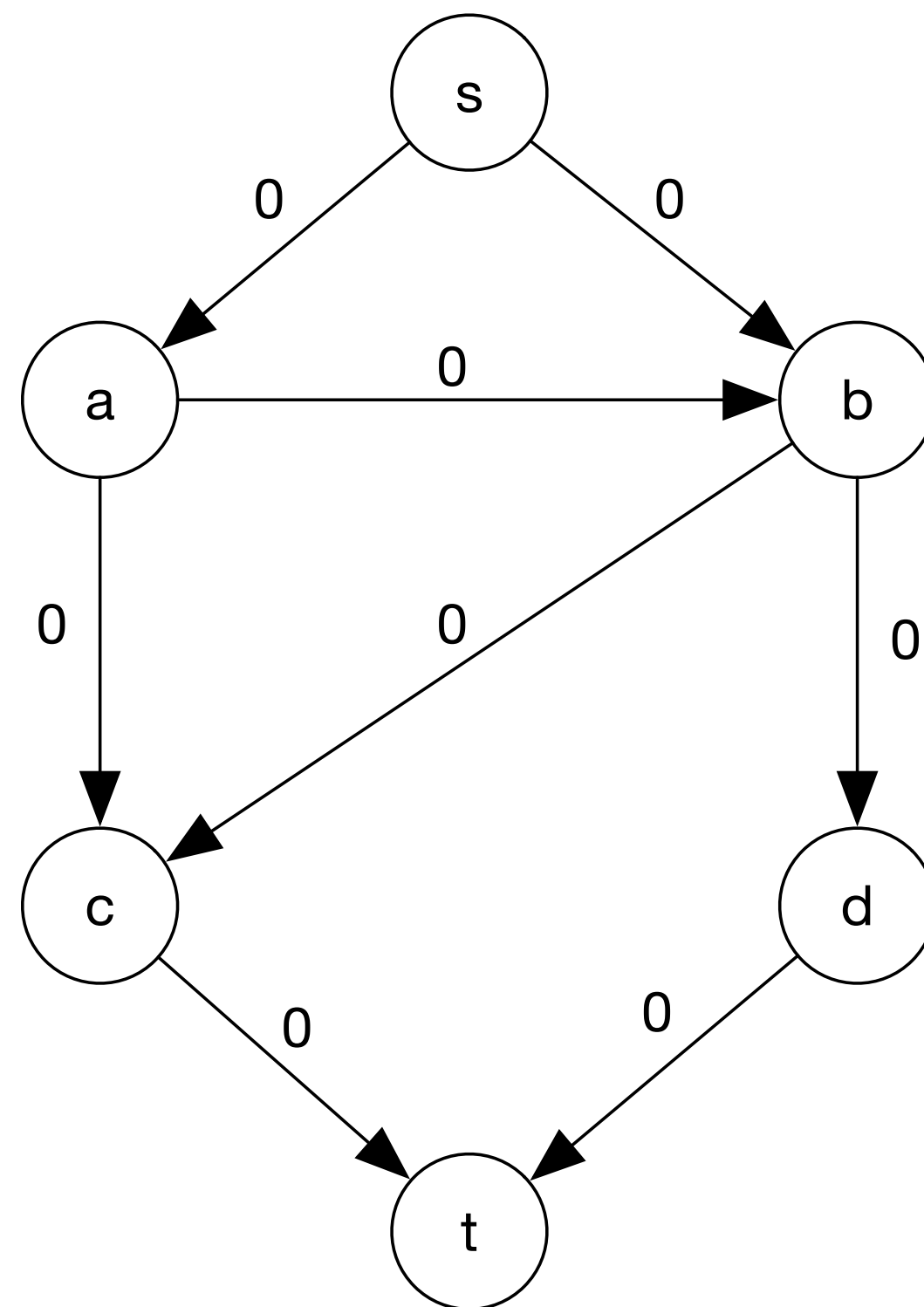
# Network flow

CAPACITY



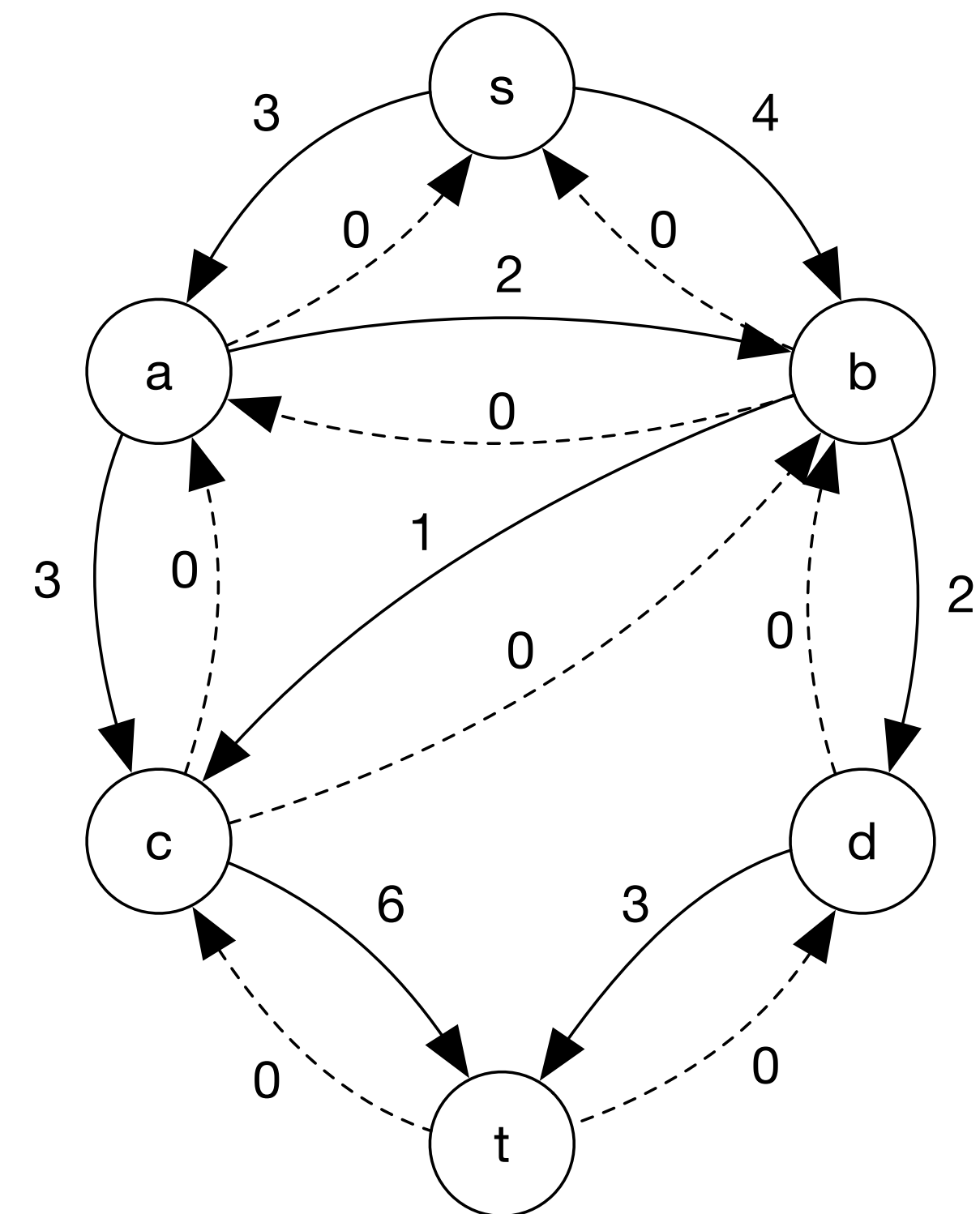
$$C_{u,v}$$

FLOW



$$f_{u,v}$$

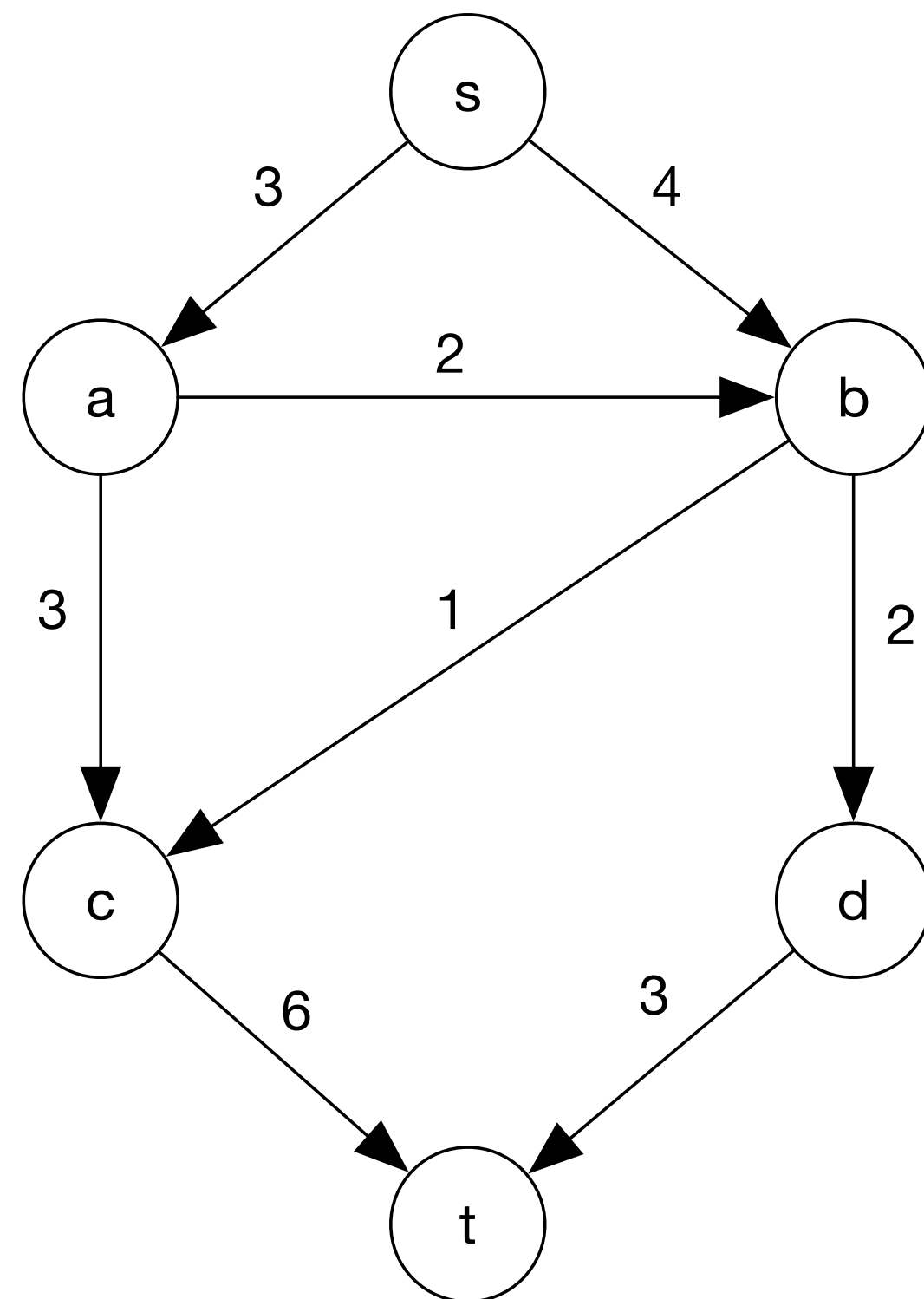
RESIDUAL



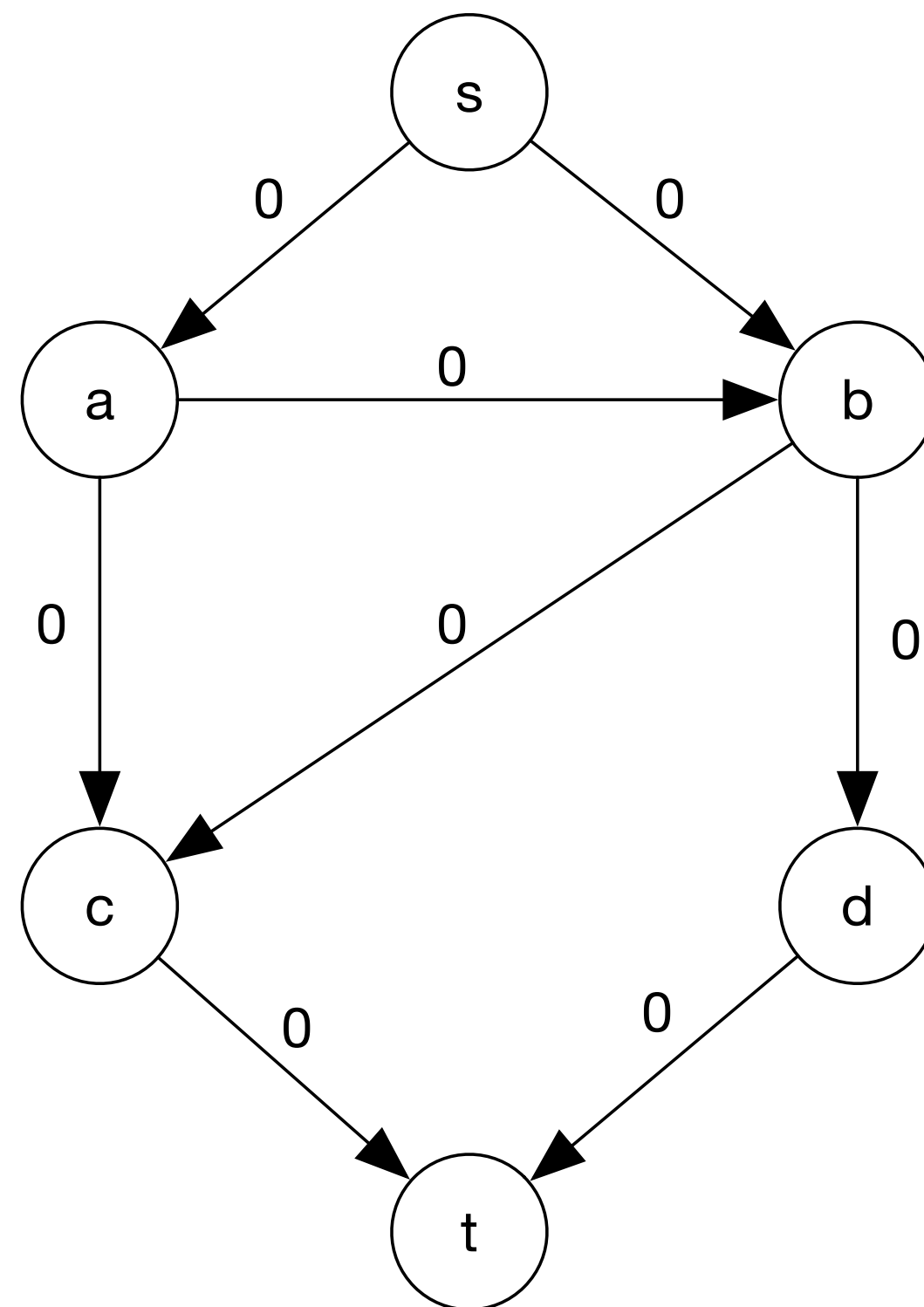
$$C_{u,v} - f_{u,v}$$
$$f_{u,v}$$

# Network flow

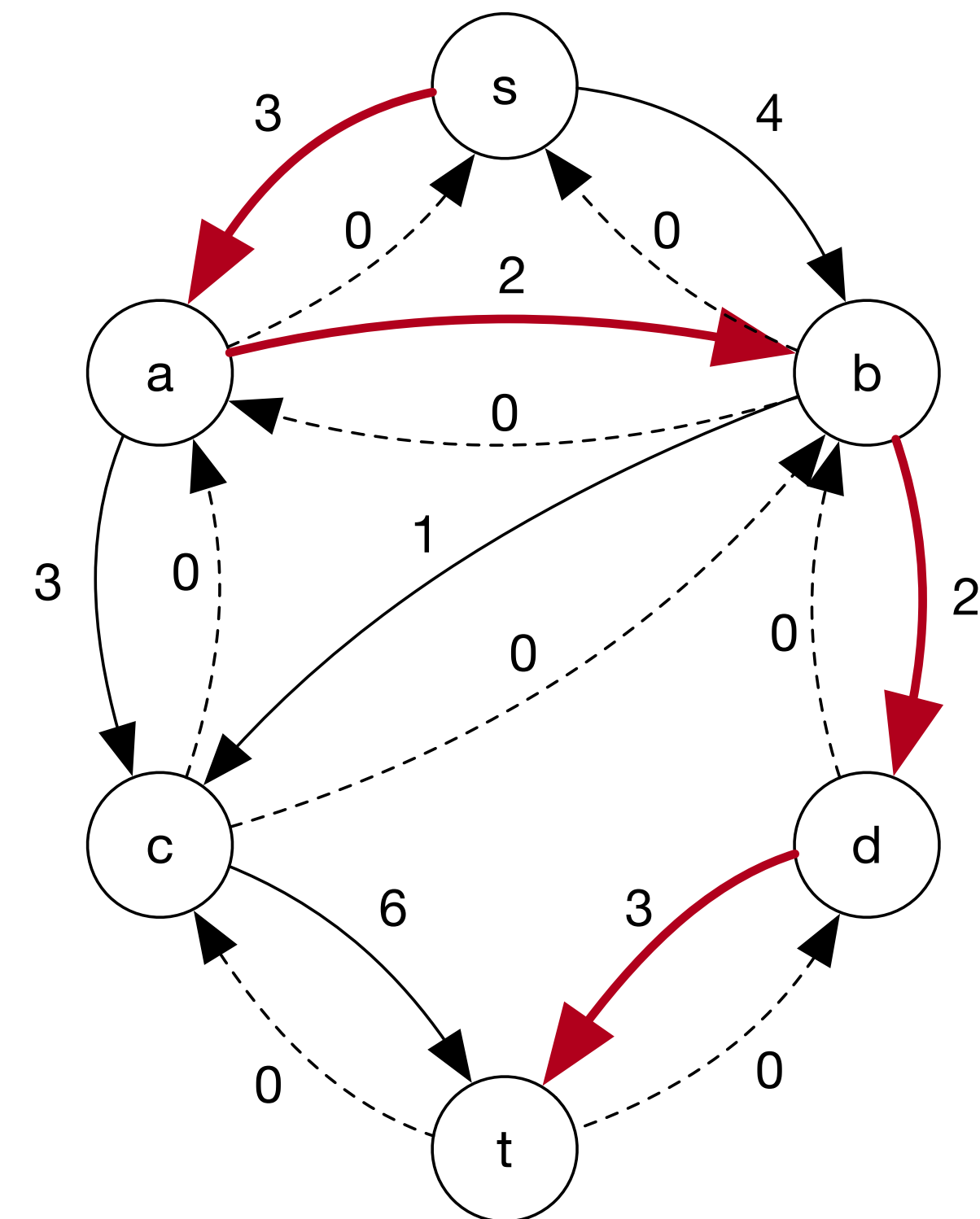
CAPACITY



FLOW

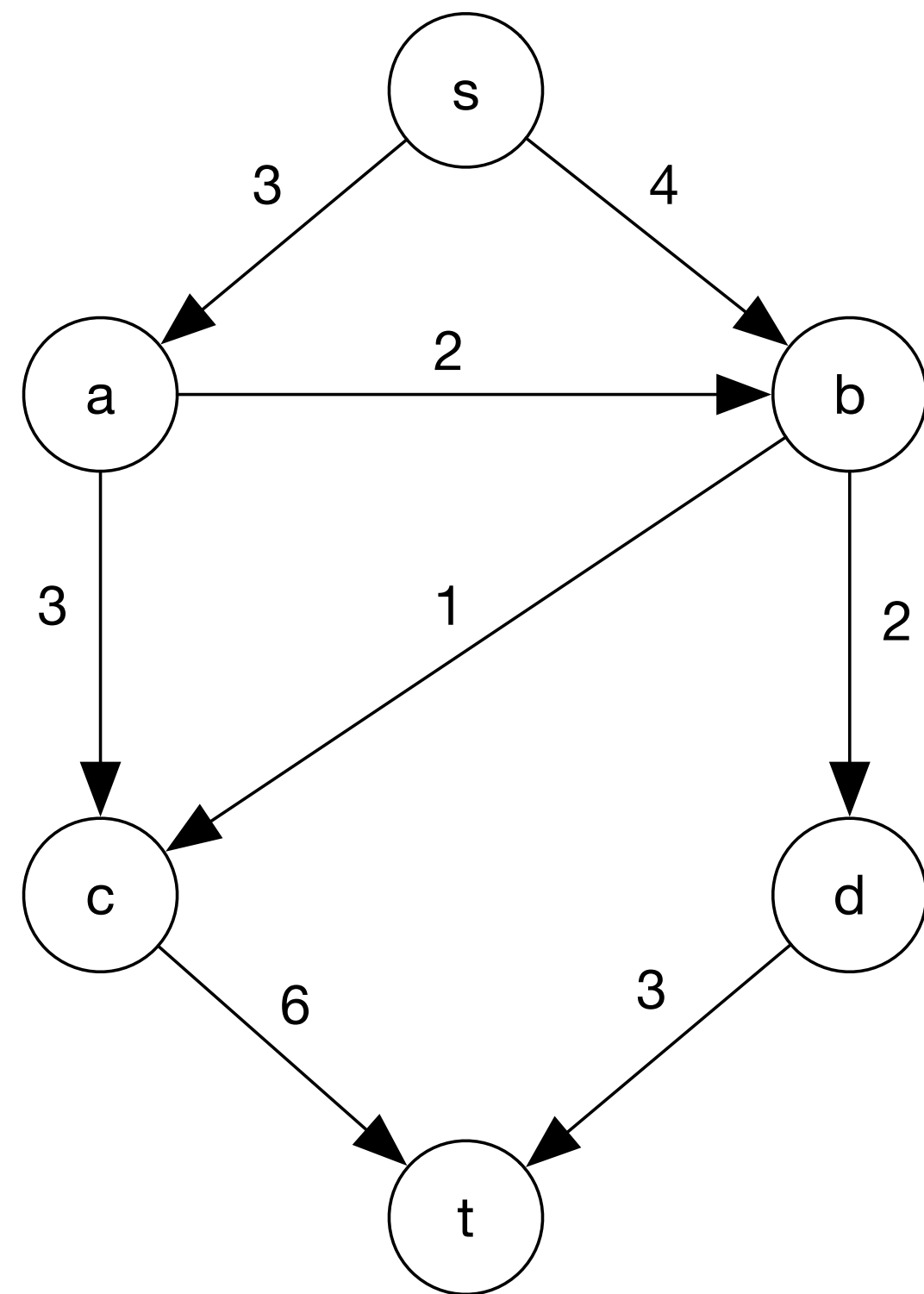


RESIDUAL

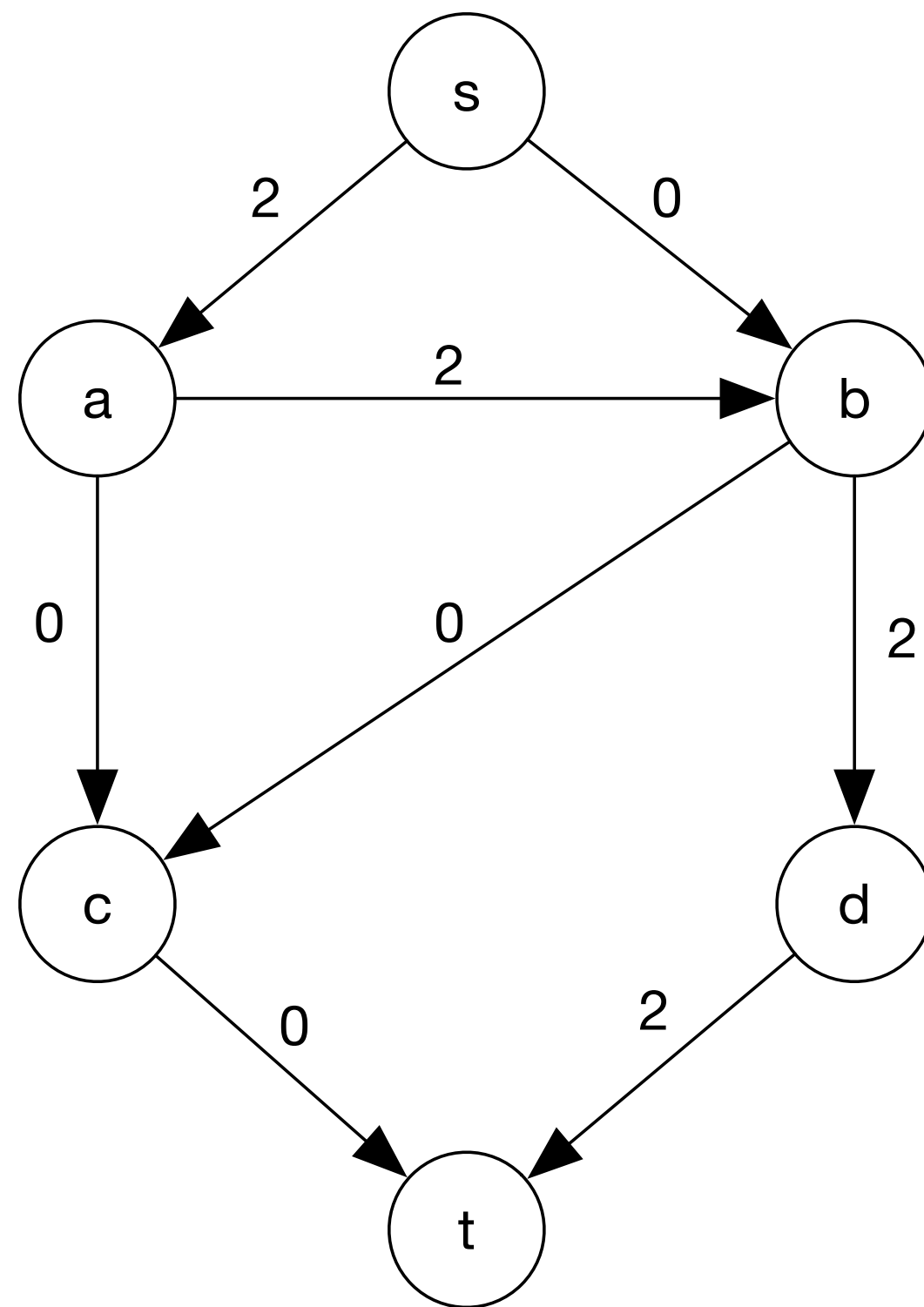


# Network flow

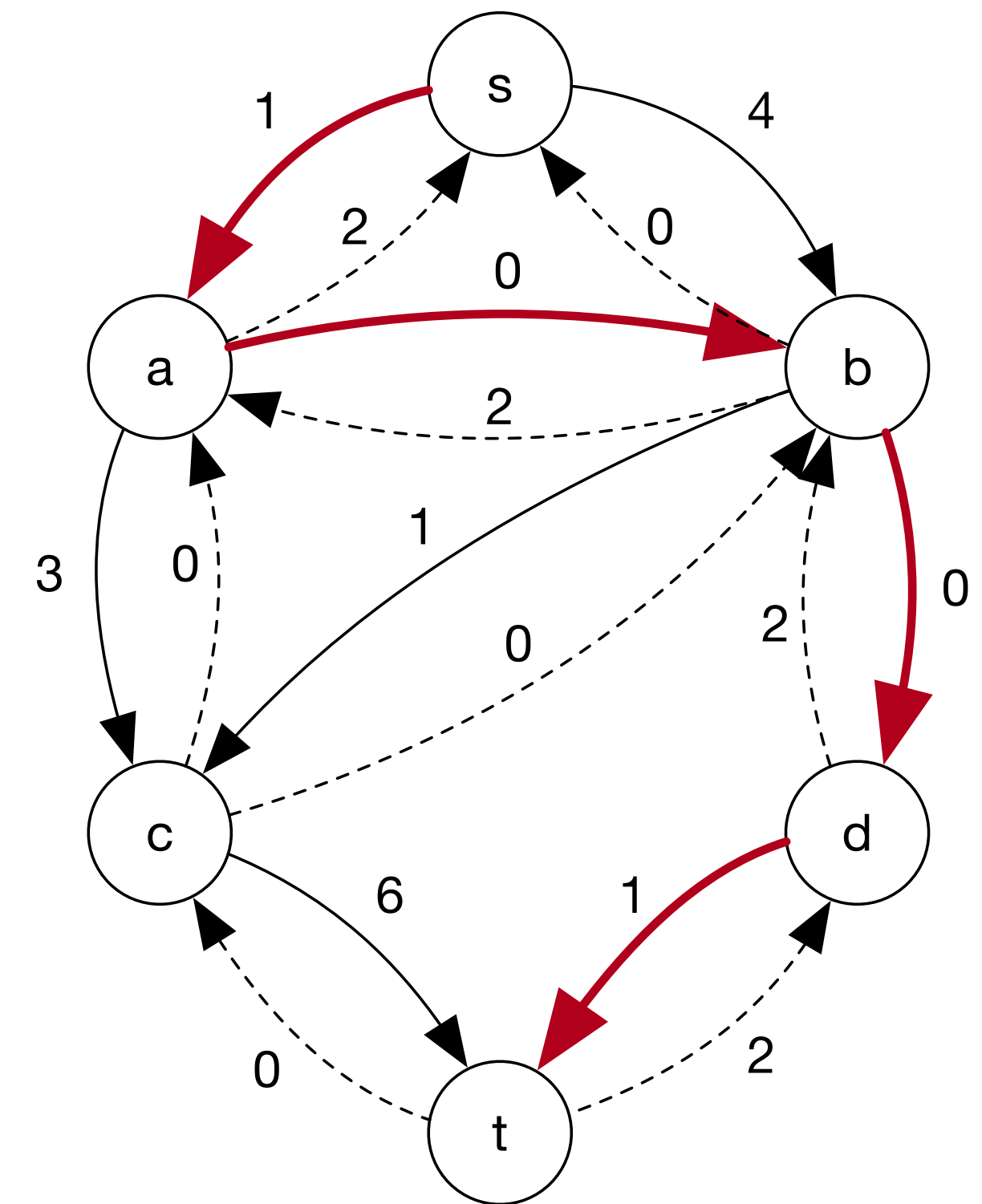
CAPACITY



FLOW



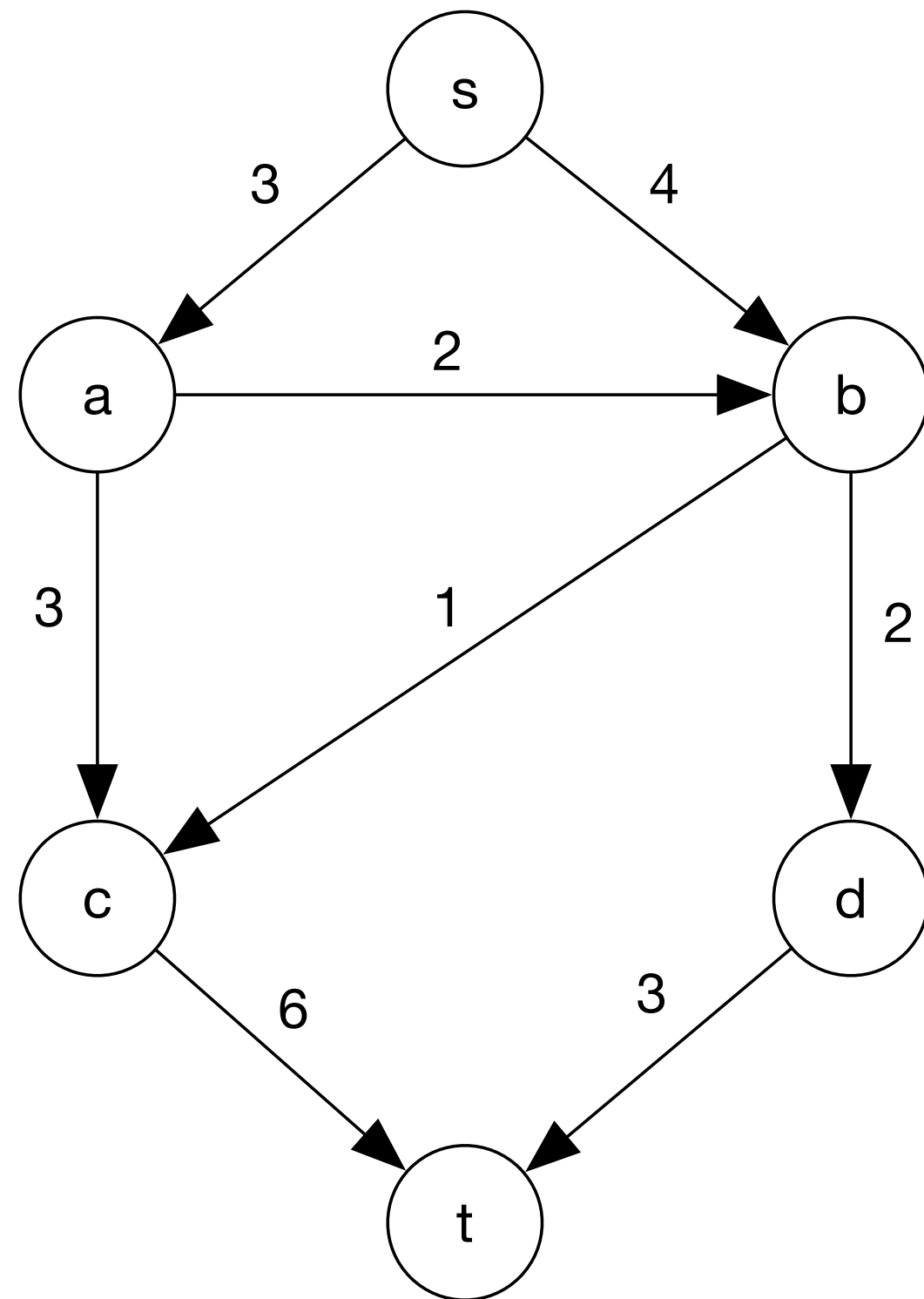
RESIDUAL



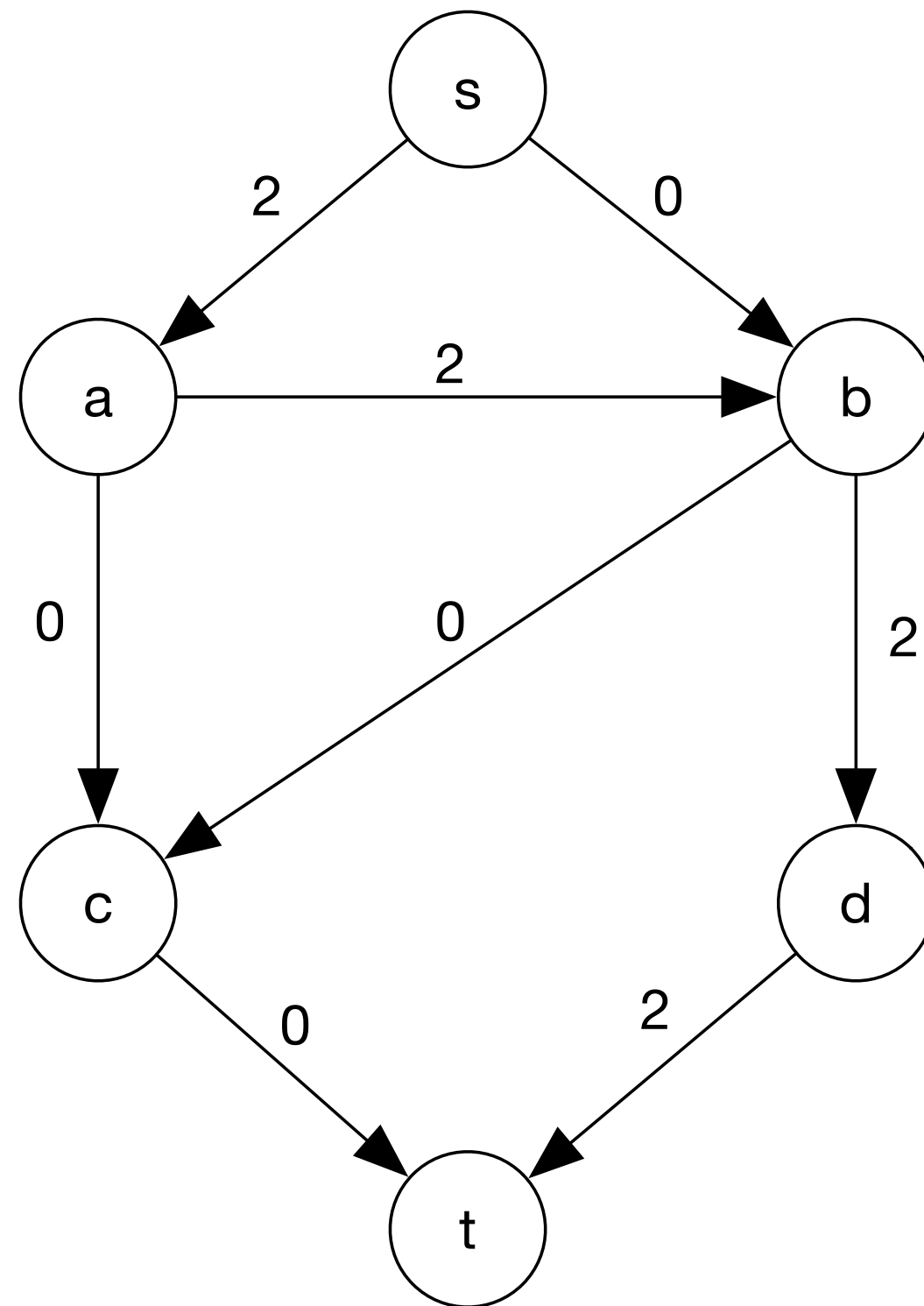


# Network flow

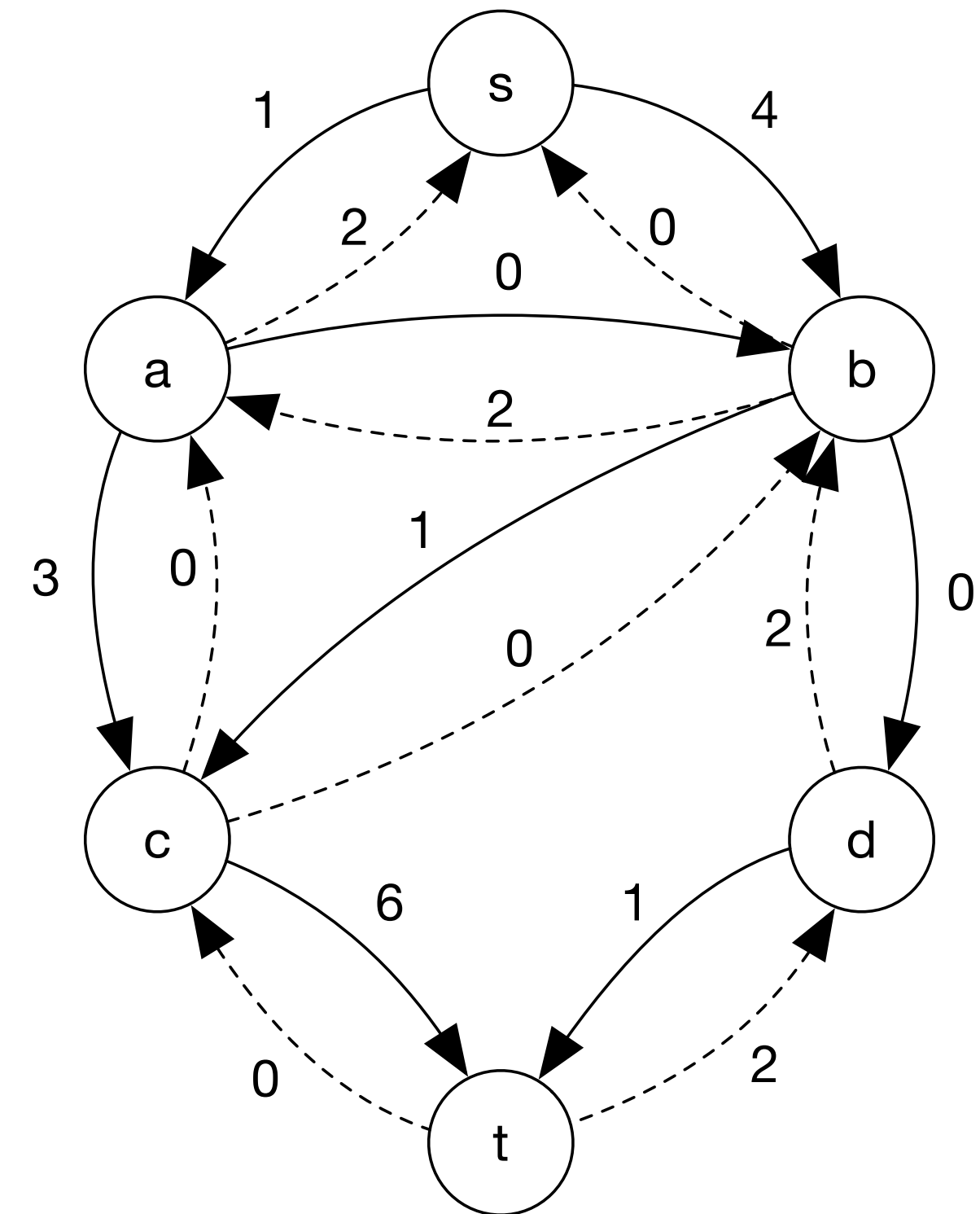
CAPACITY



FLOW

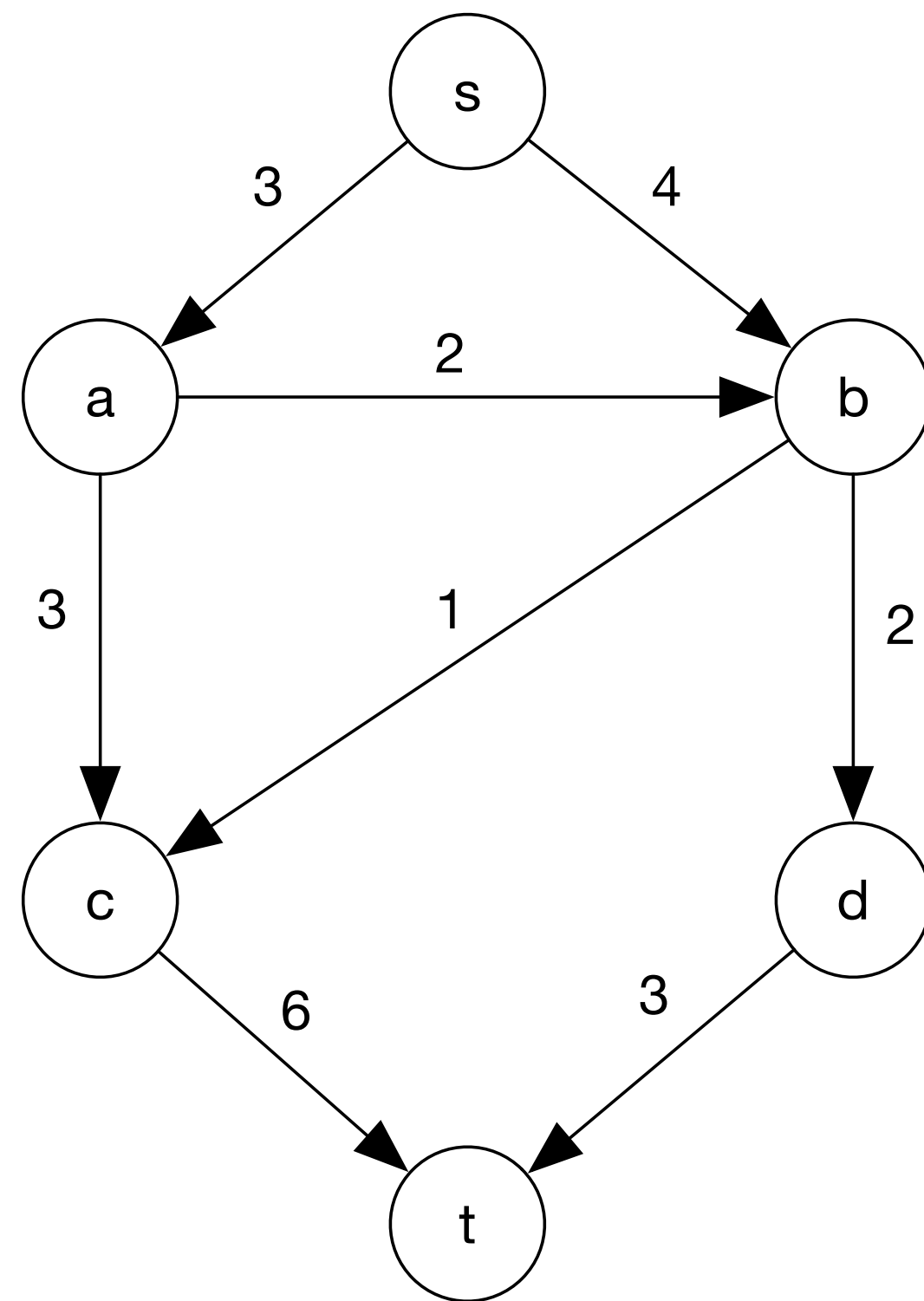


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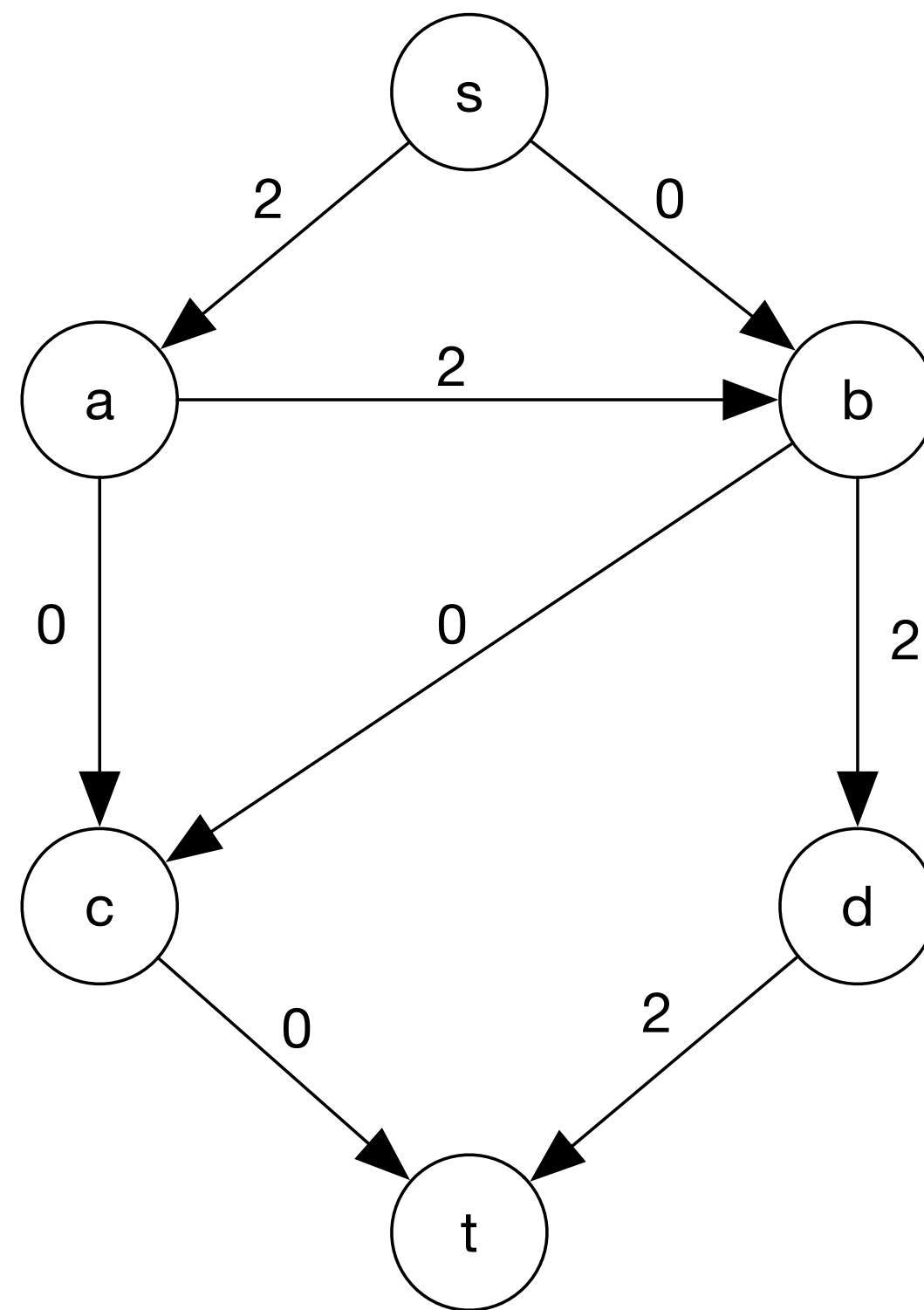


# Network flow

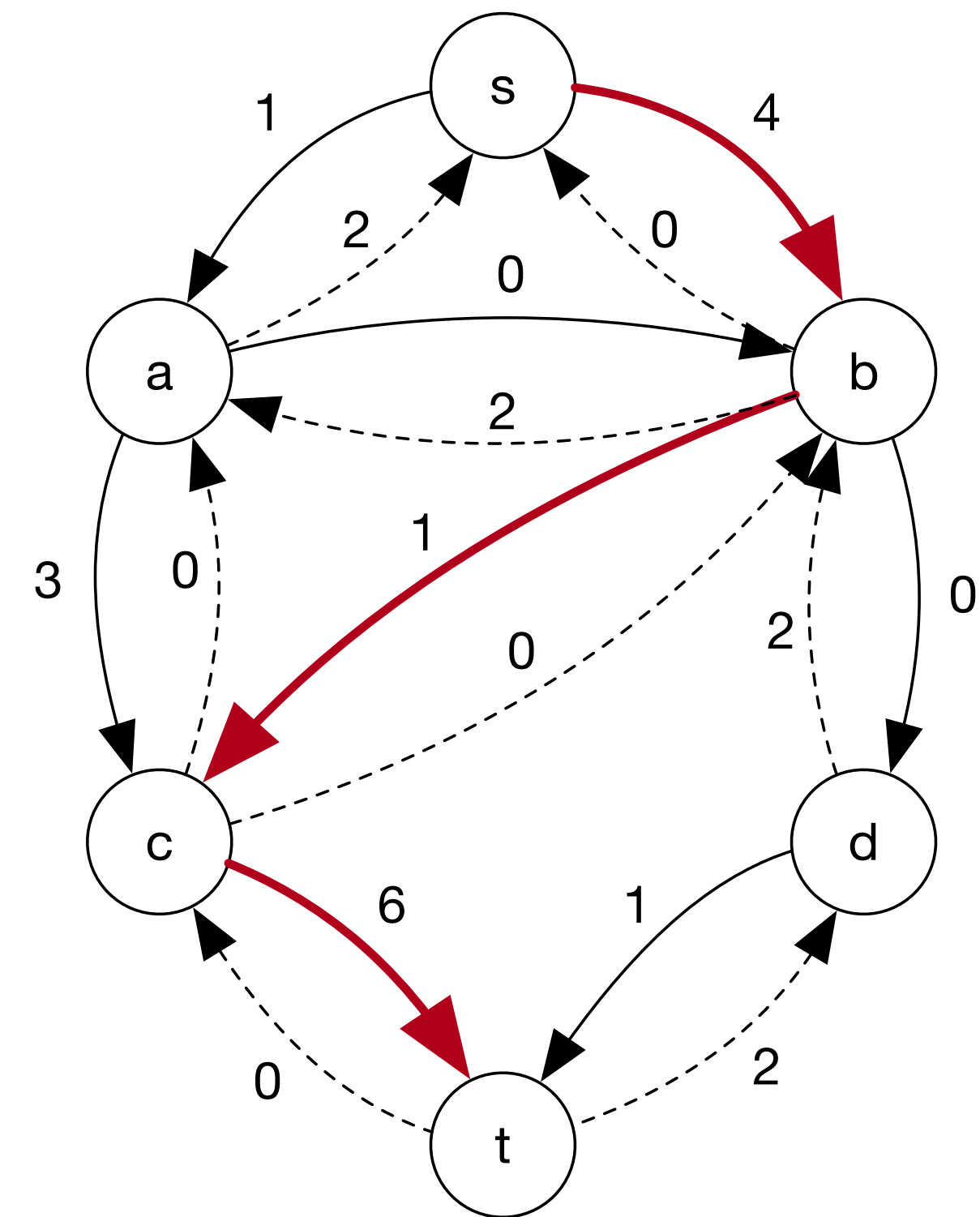
CAPACITY



FLOW

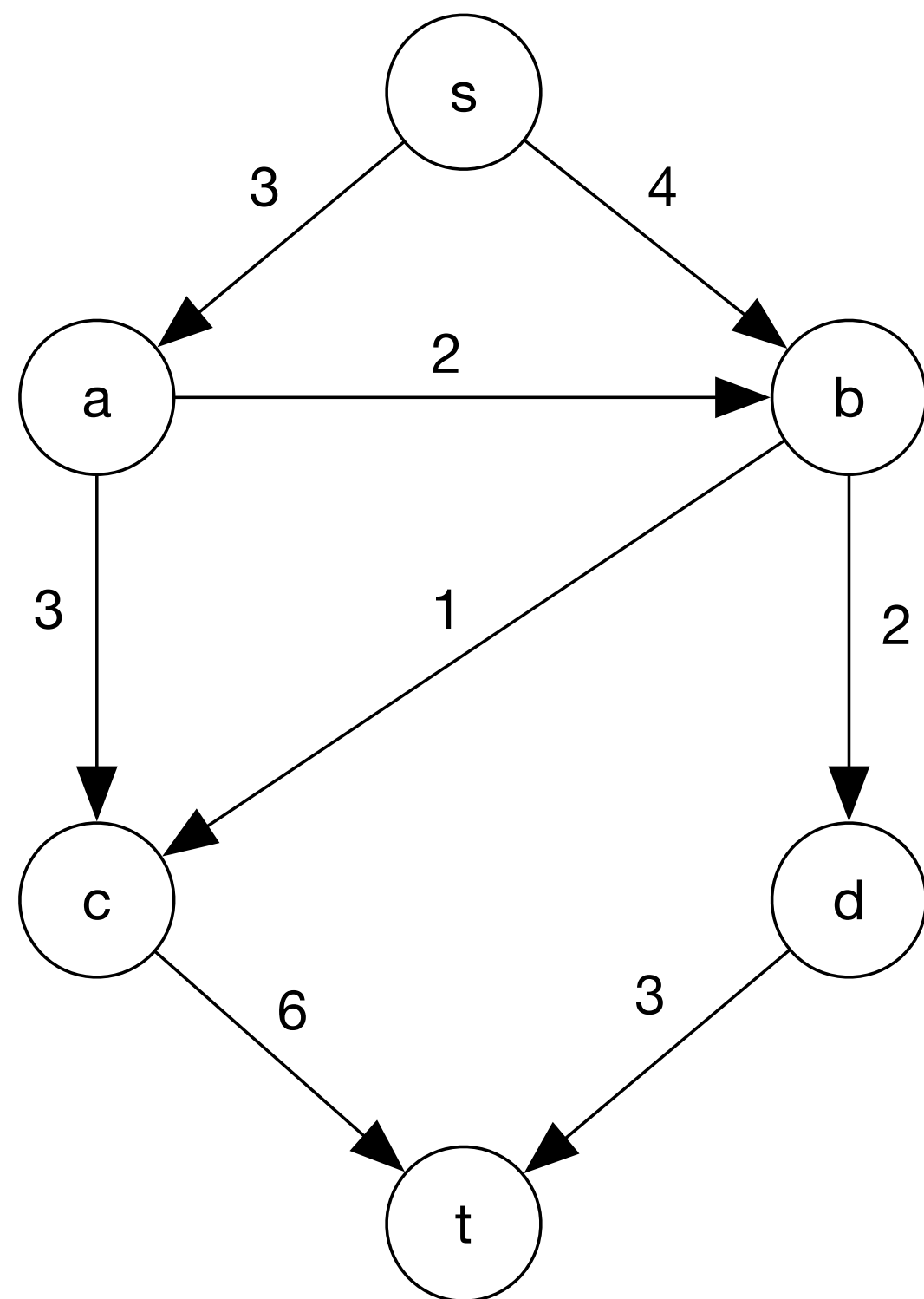


RESIDUAL

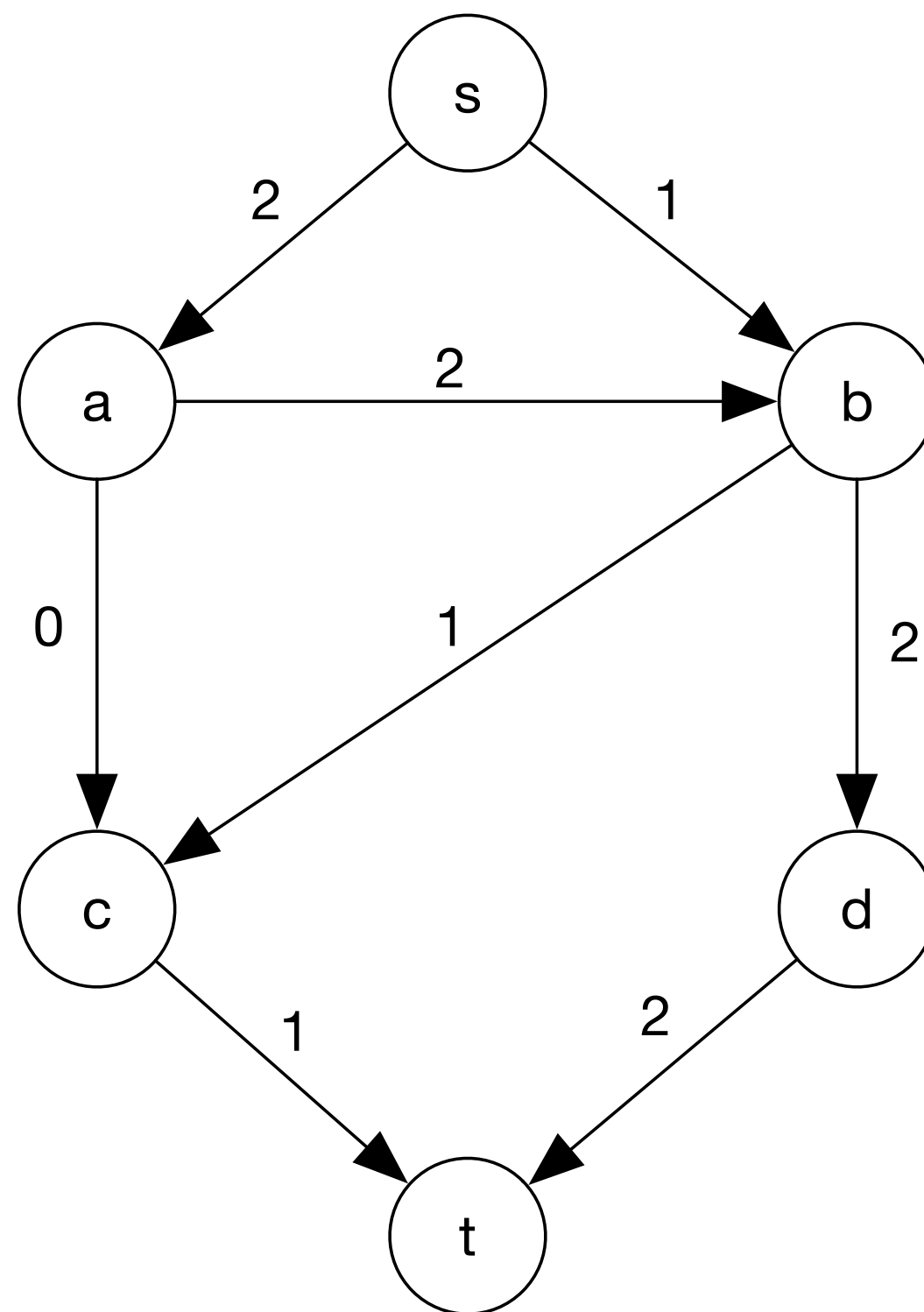


# Network flow

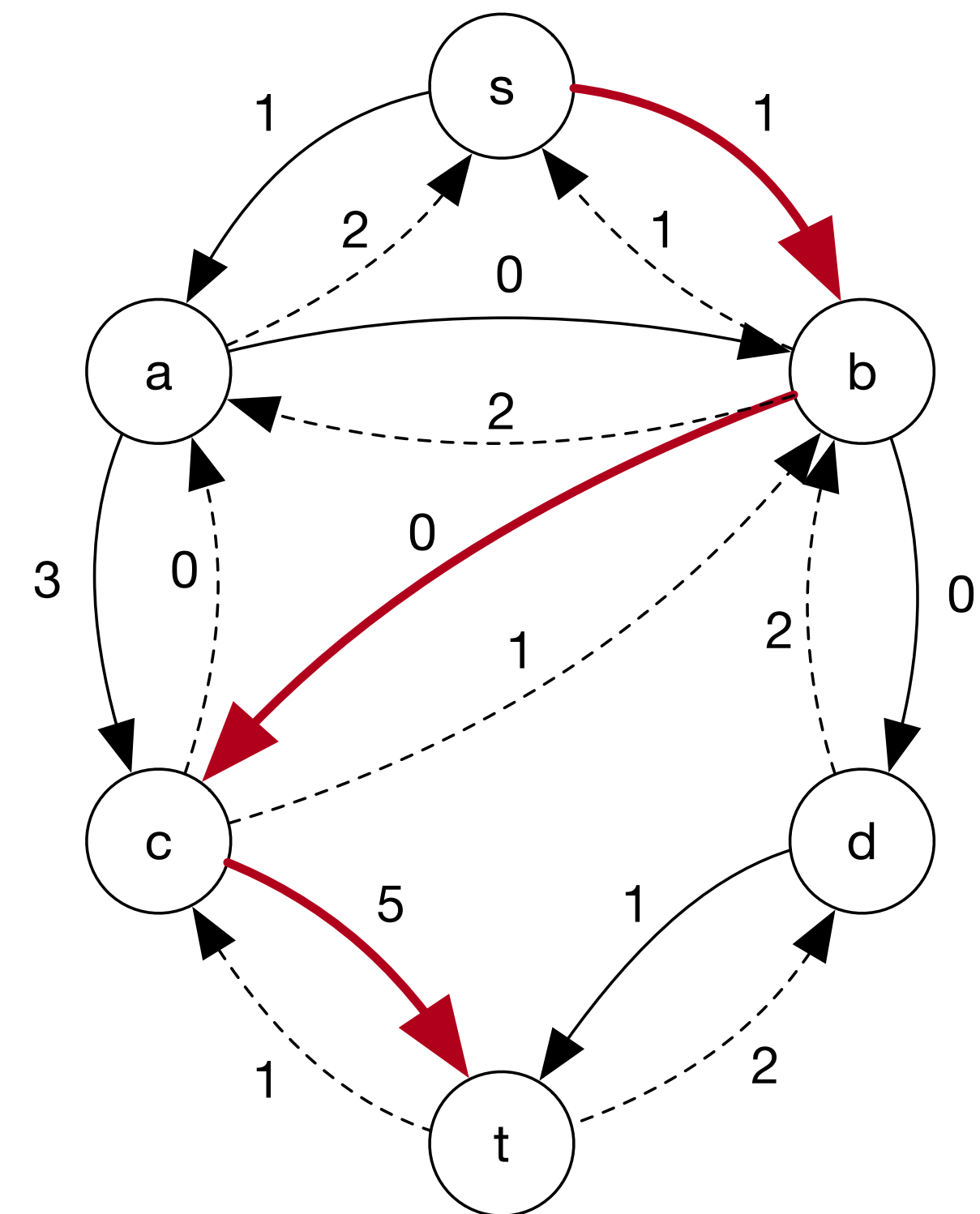
CAPACITY



FLOW

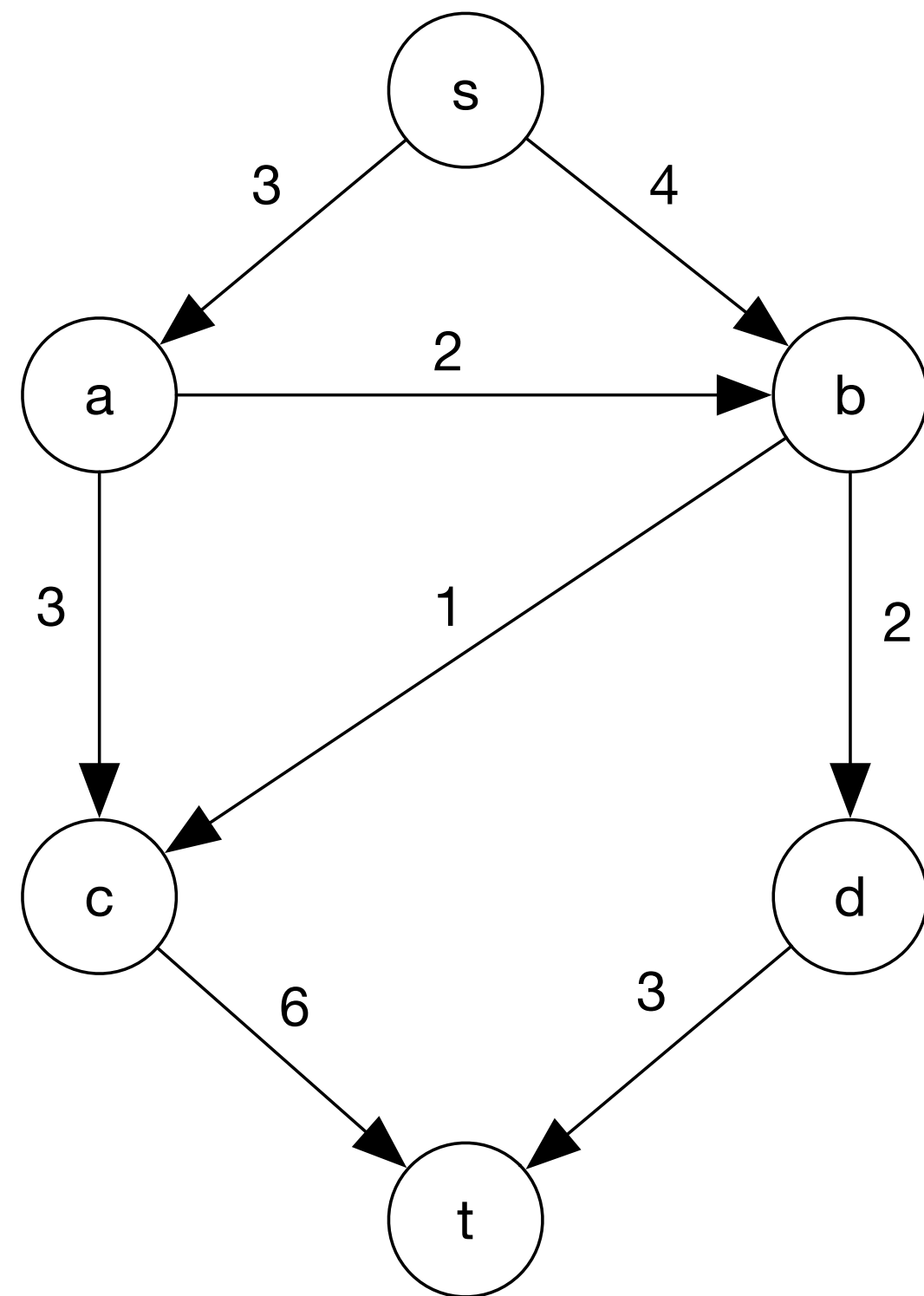


RESIDUAL

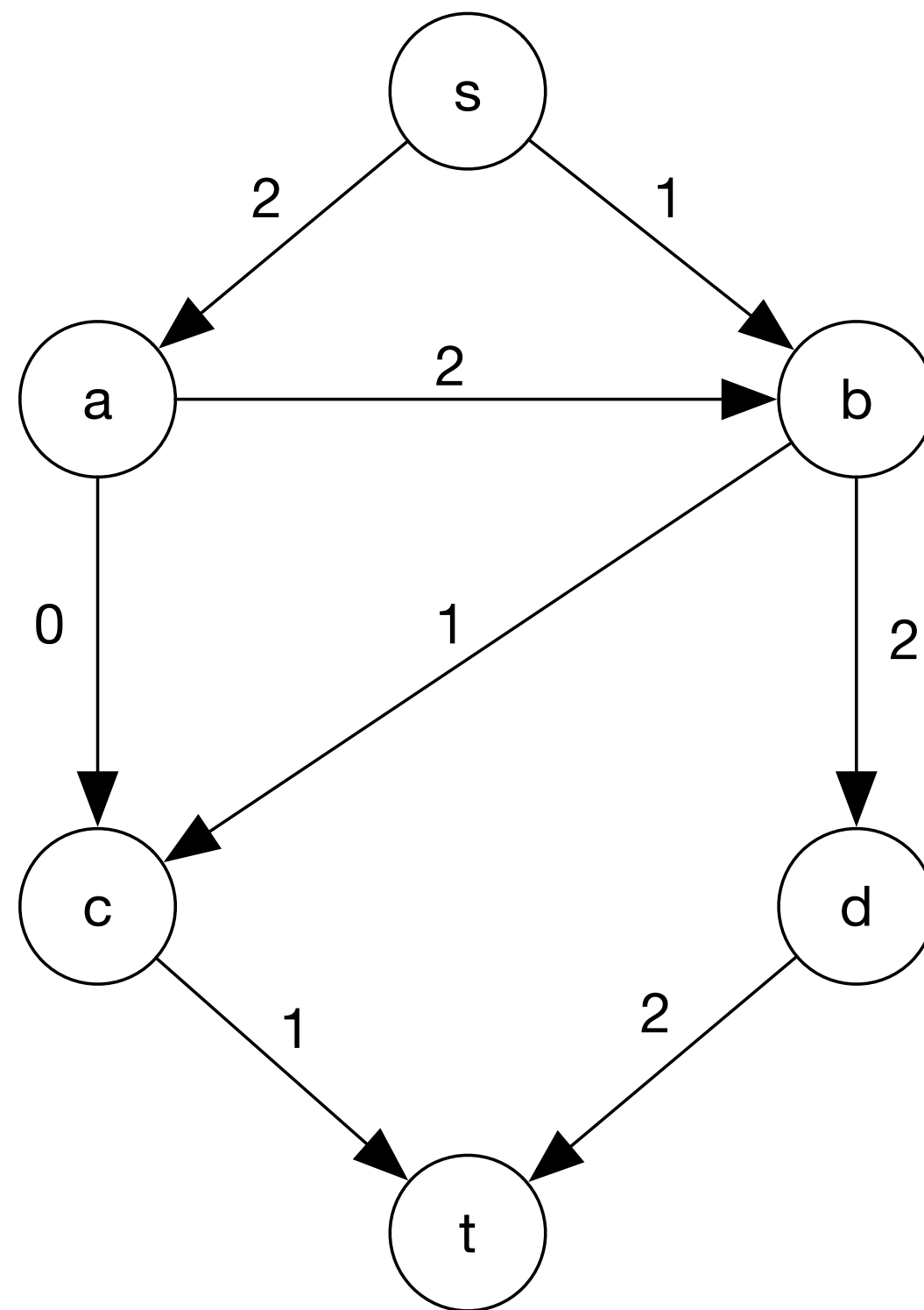


# Network flow

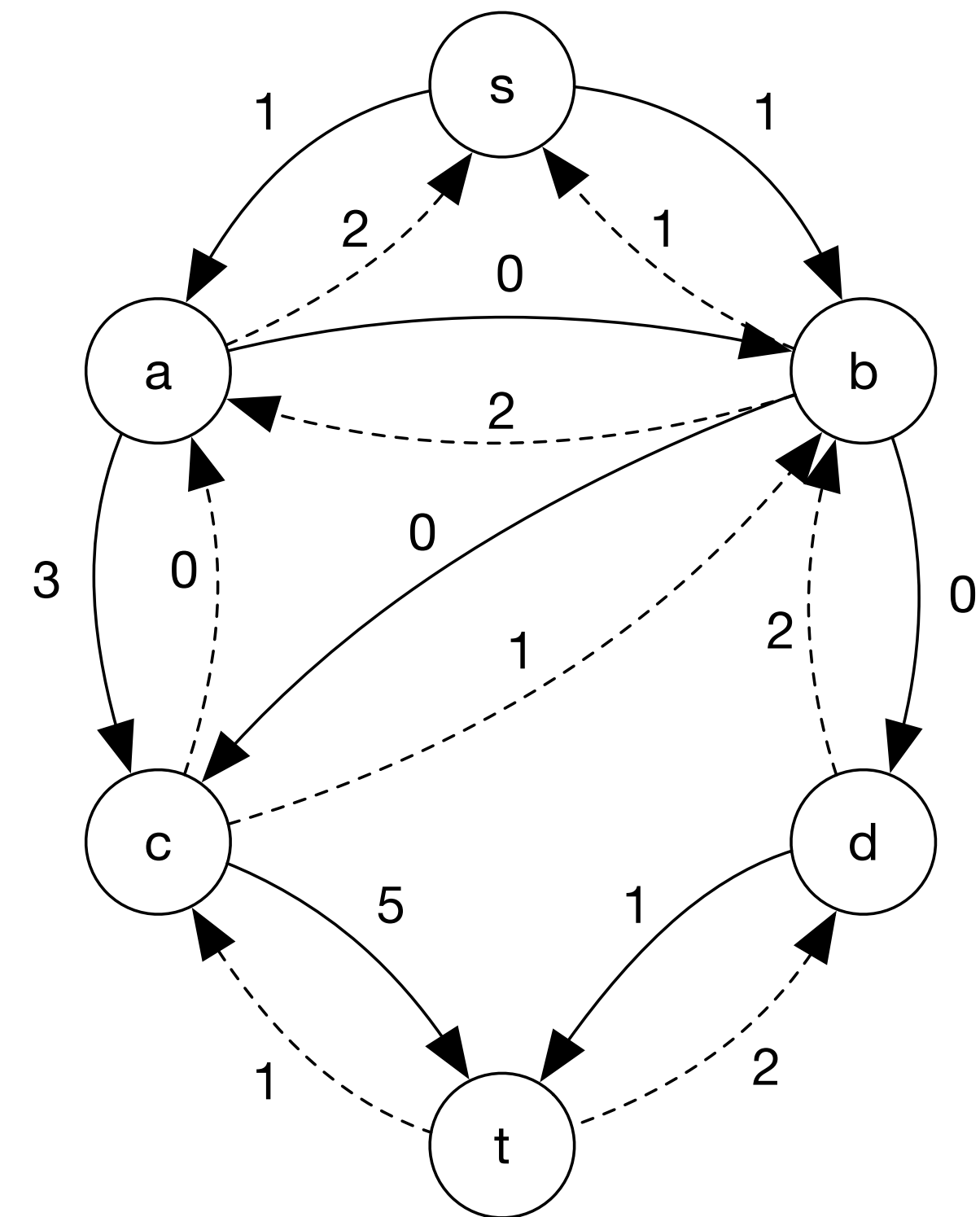
CAPACITY



FLOW

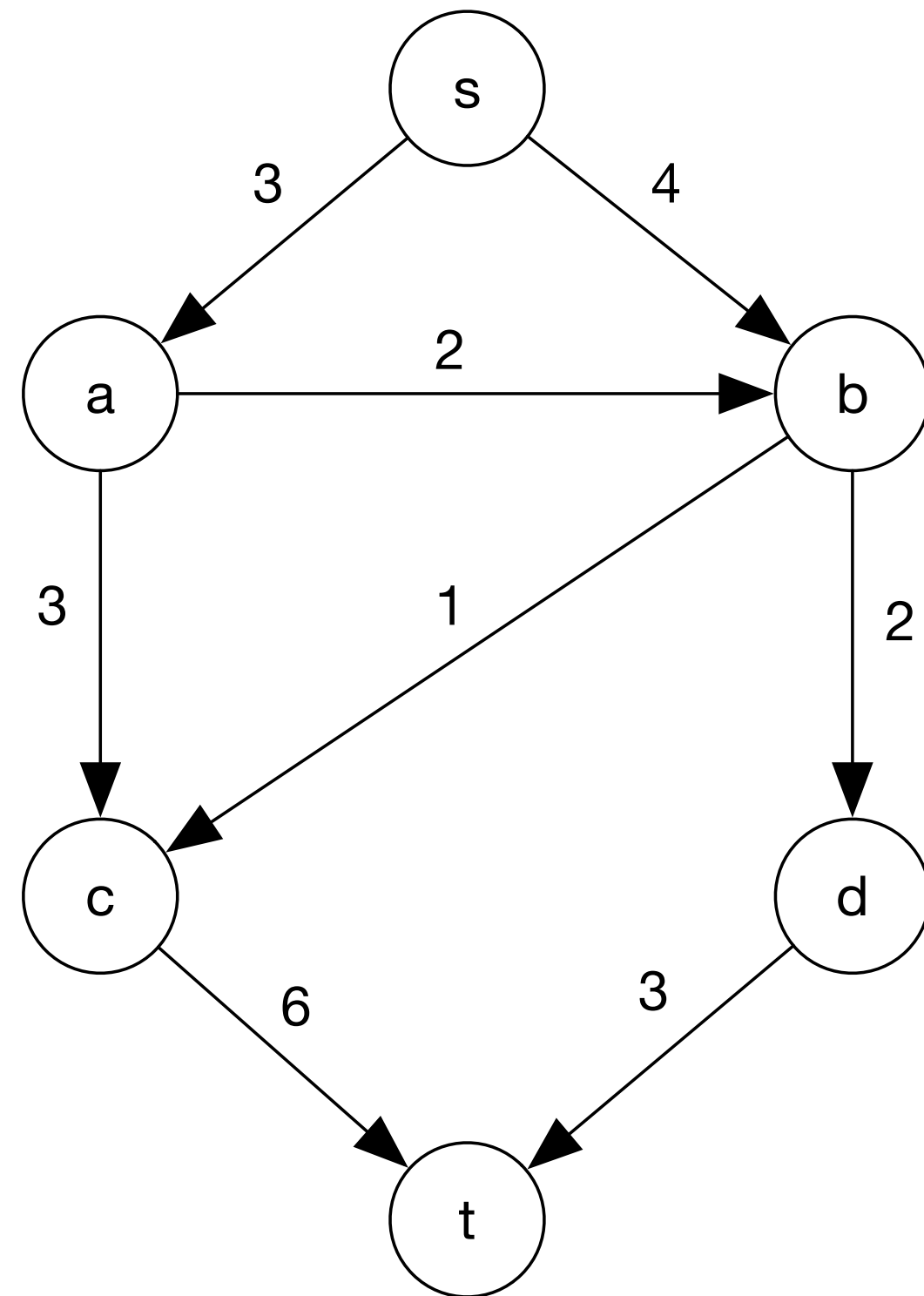


RESIDUAL

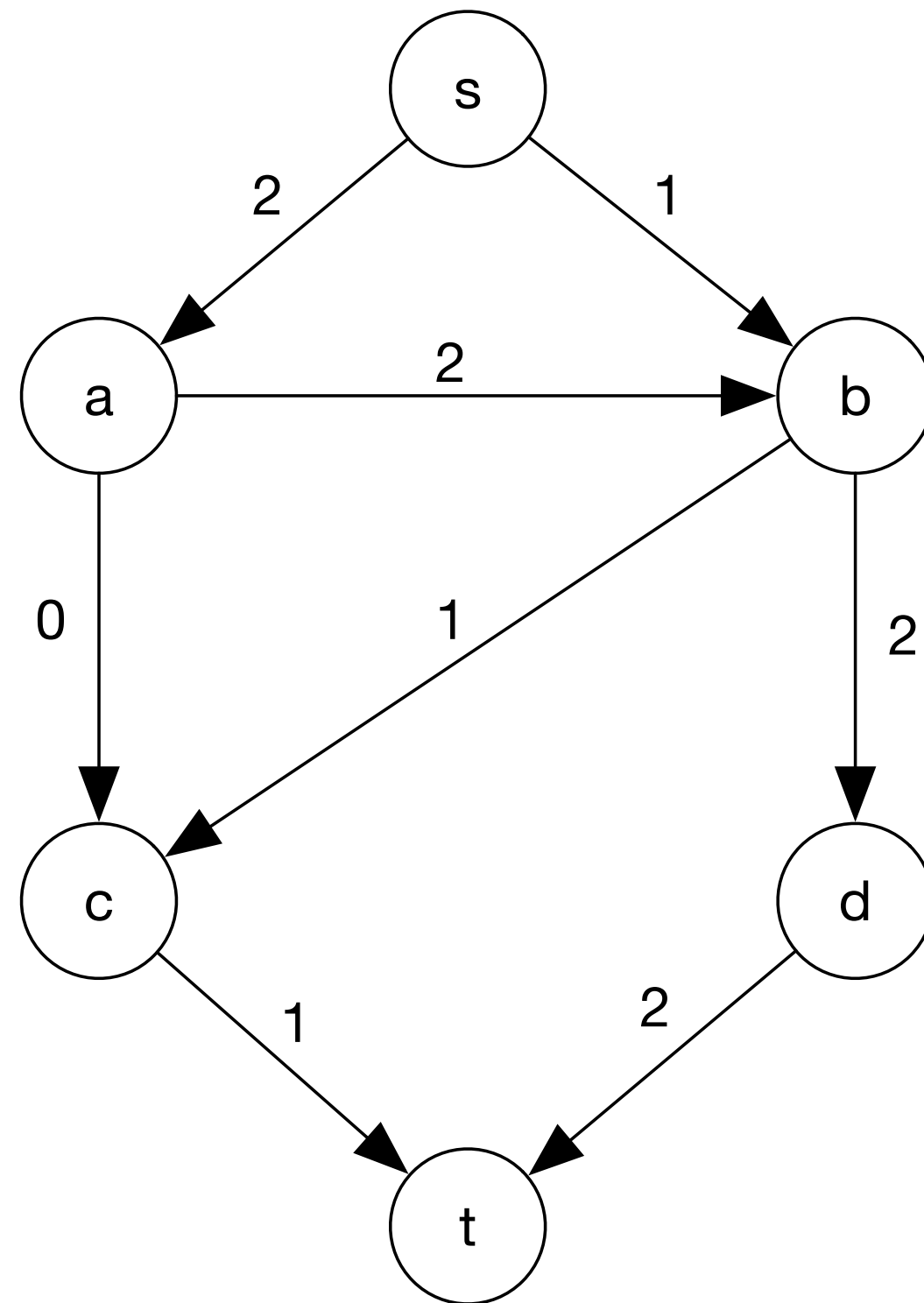


# Network flow

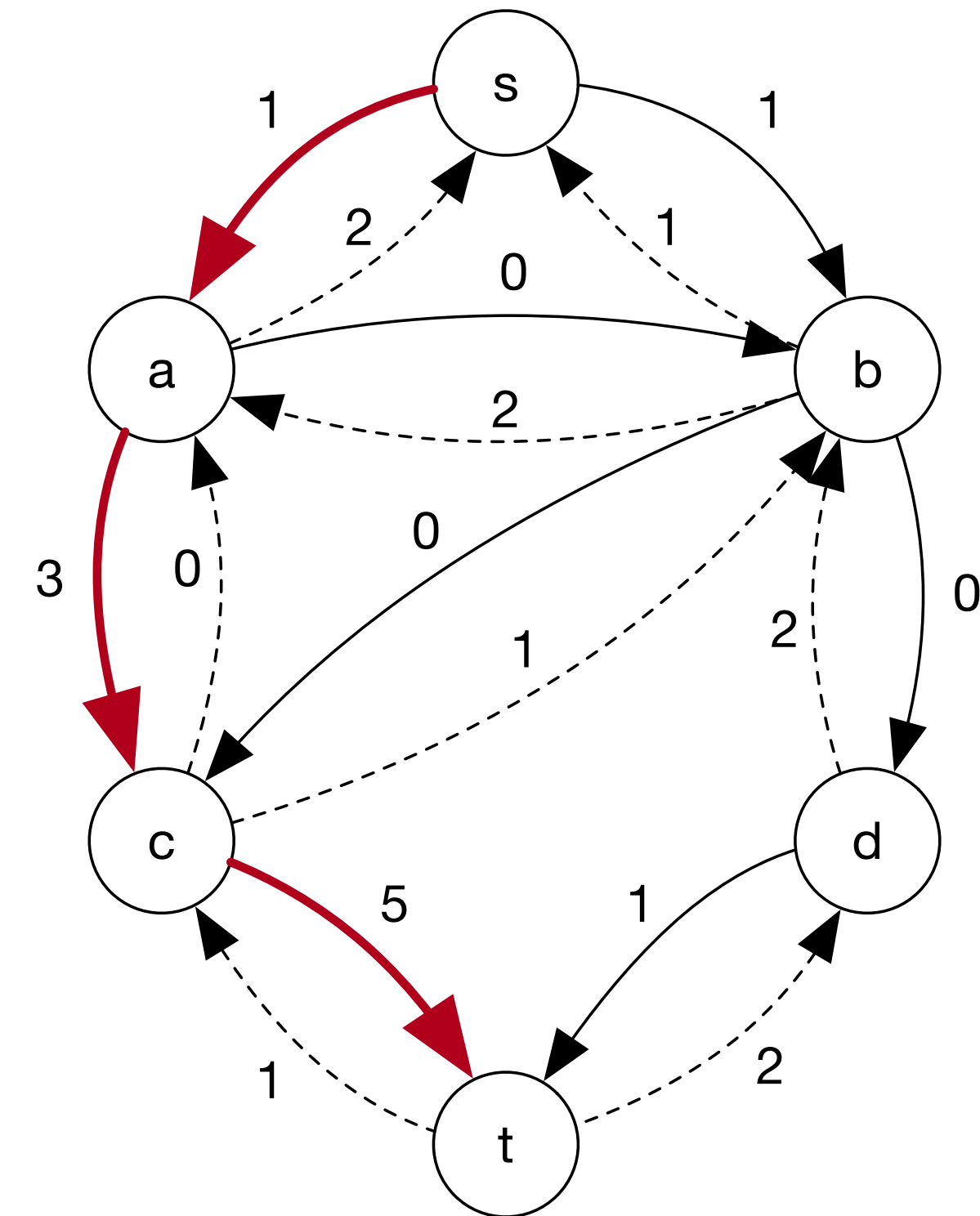
CAPACITY



FLOW

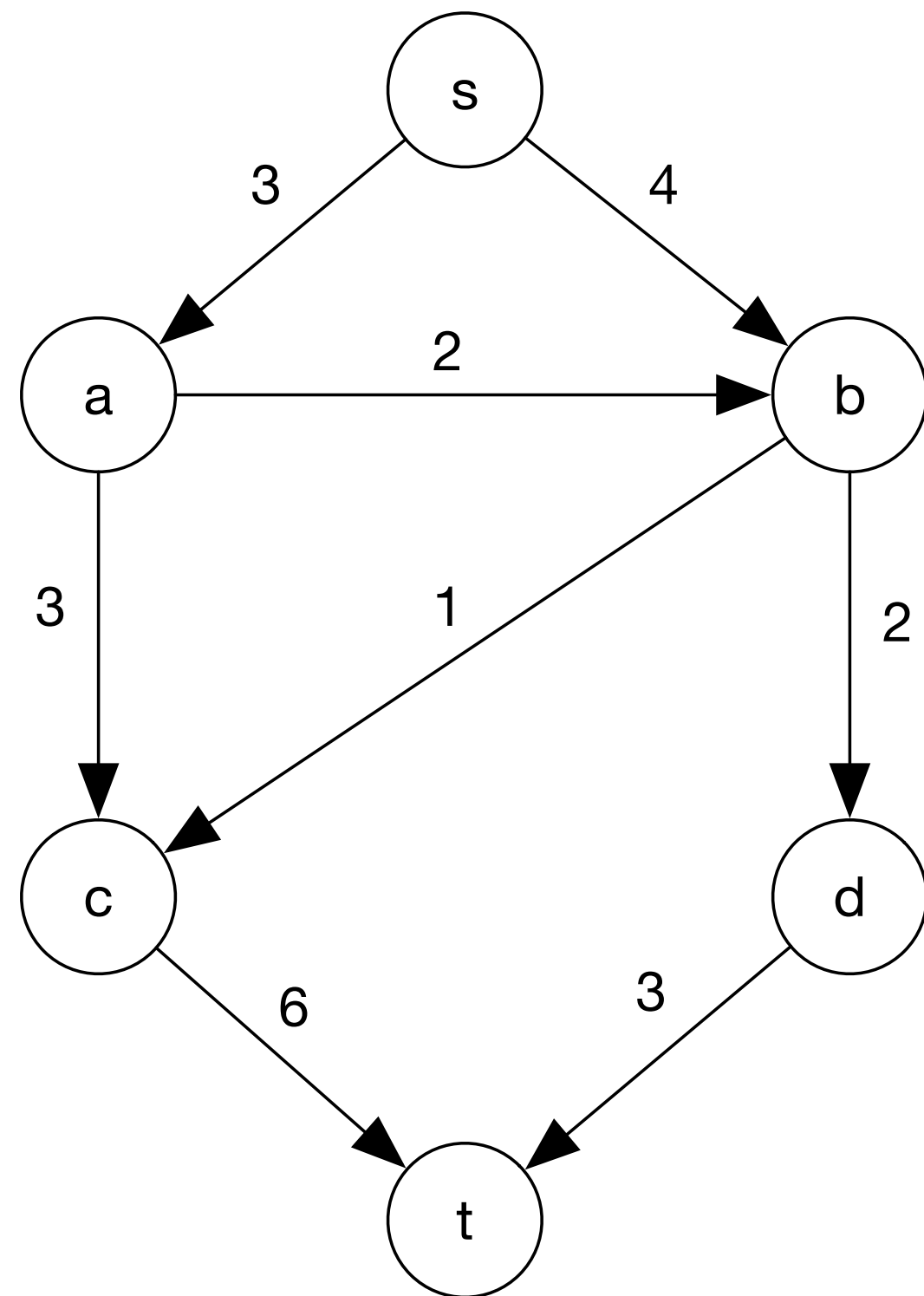


RESIDUAL

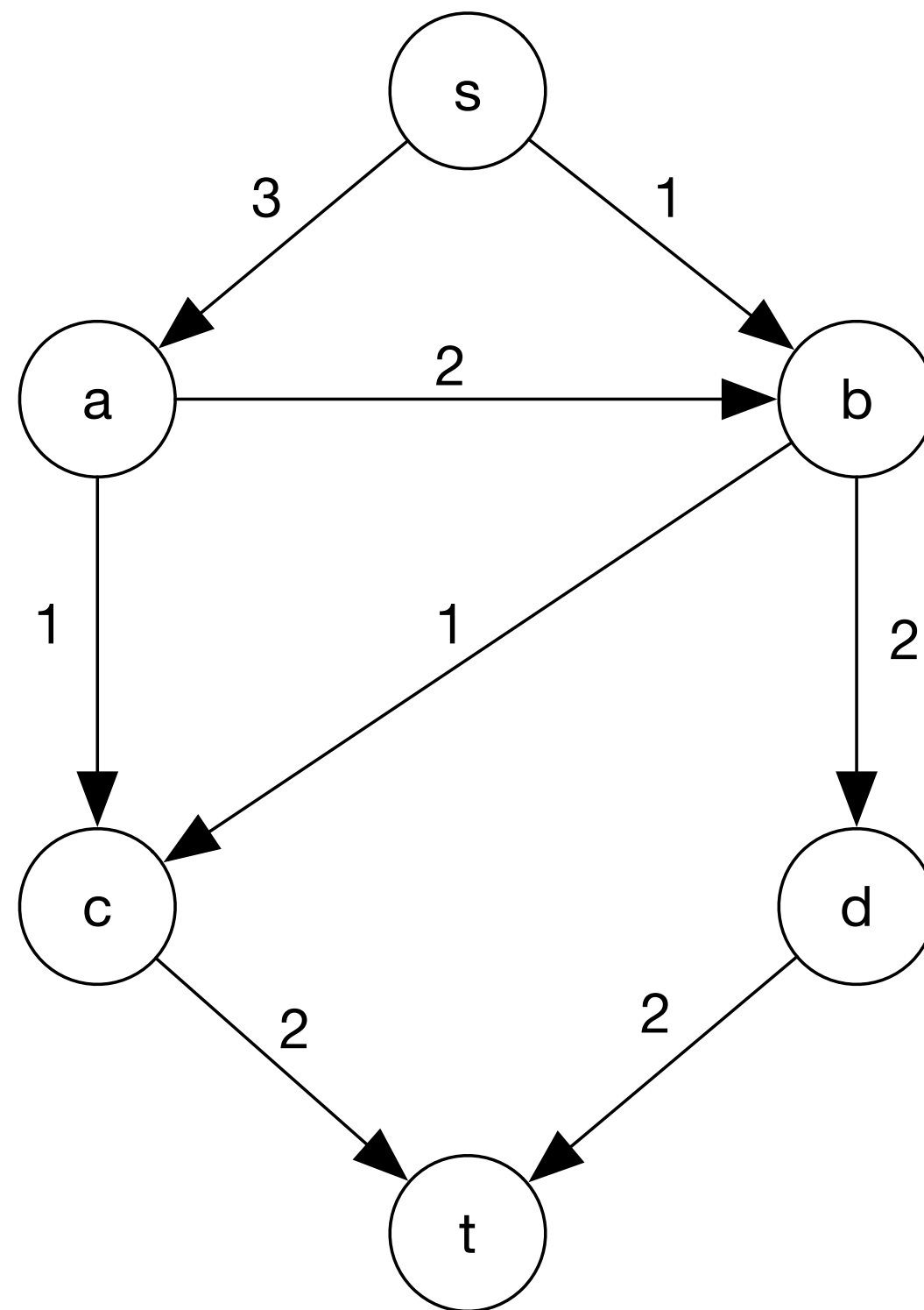


# Network flow

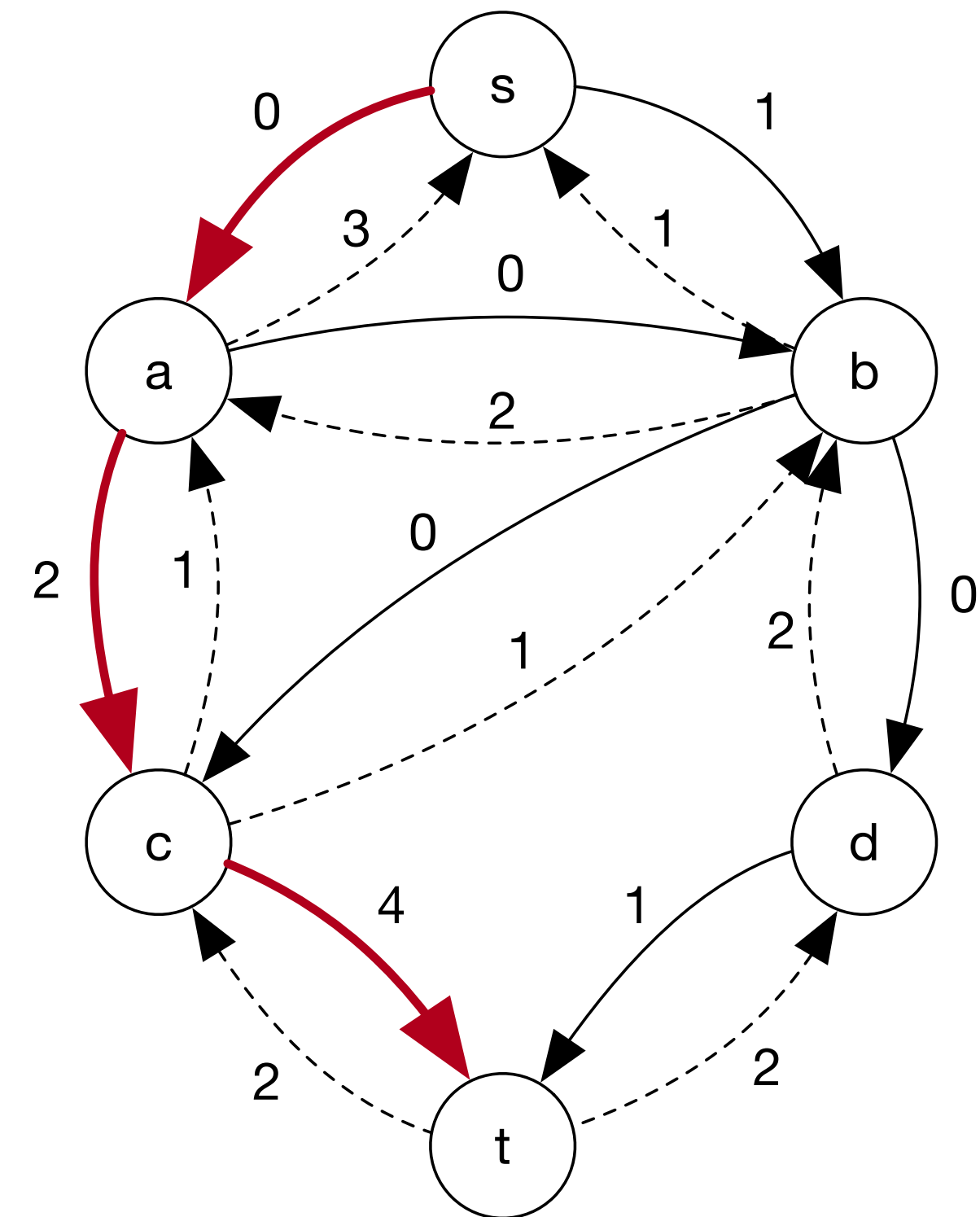
CAPACITY



FLOW

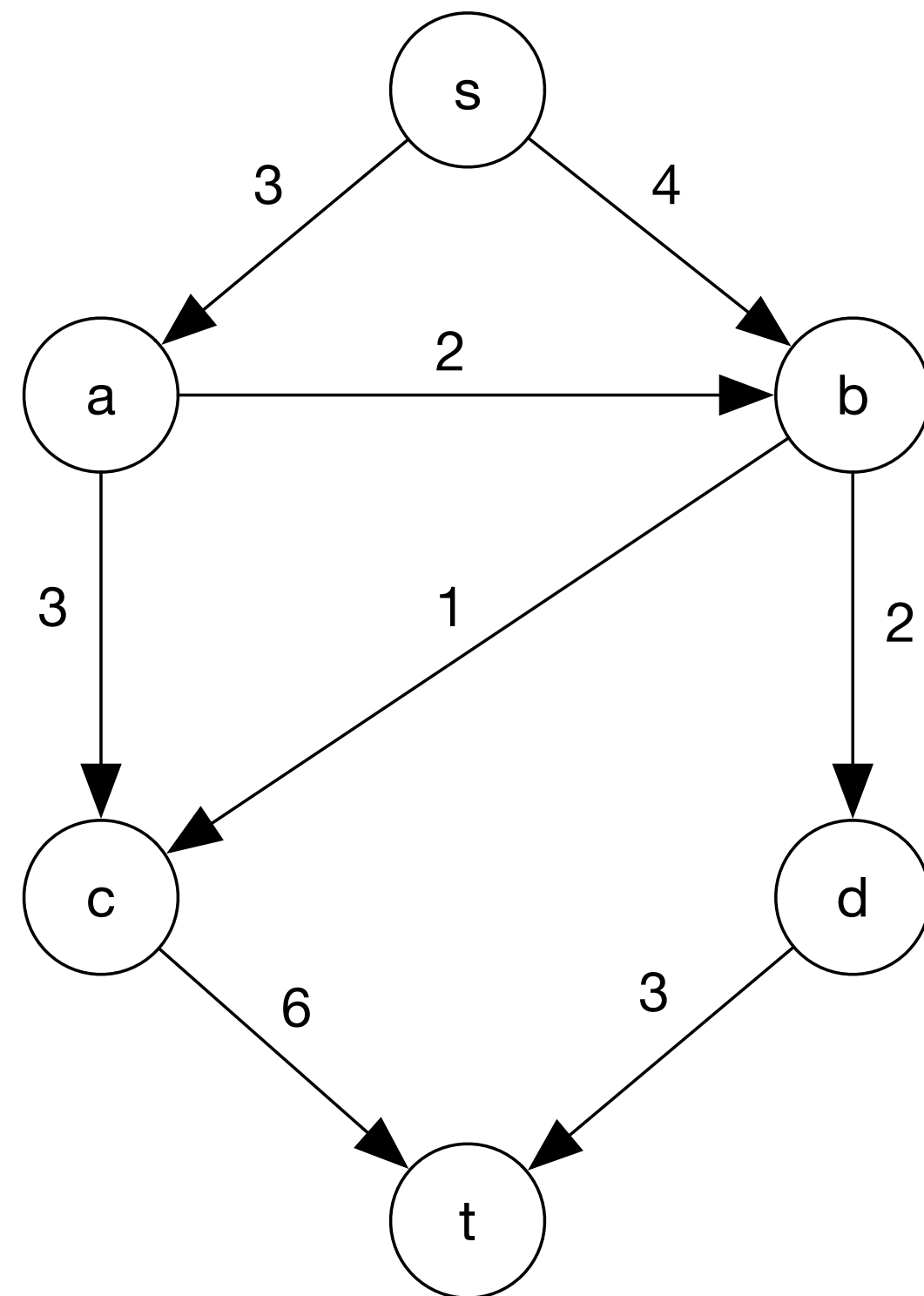


RESIDUAL

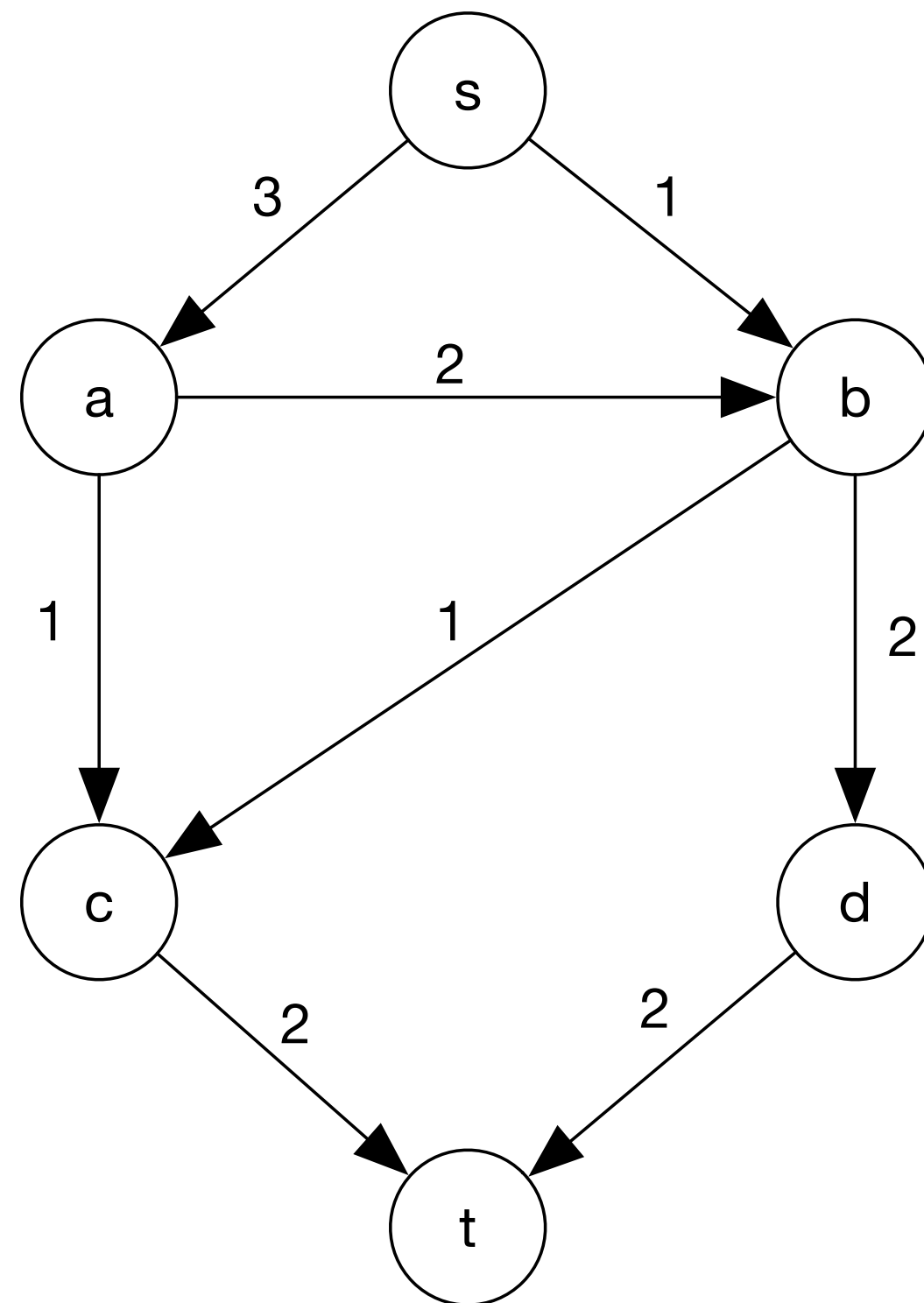


# Network flow

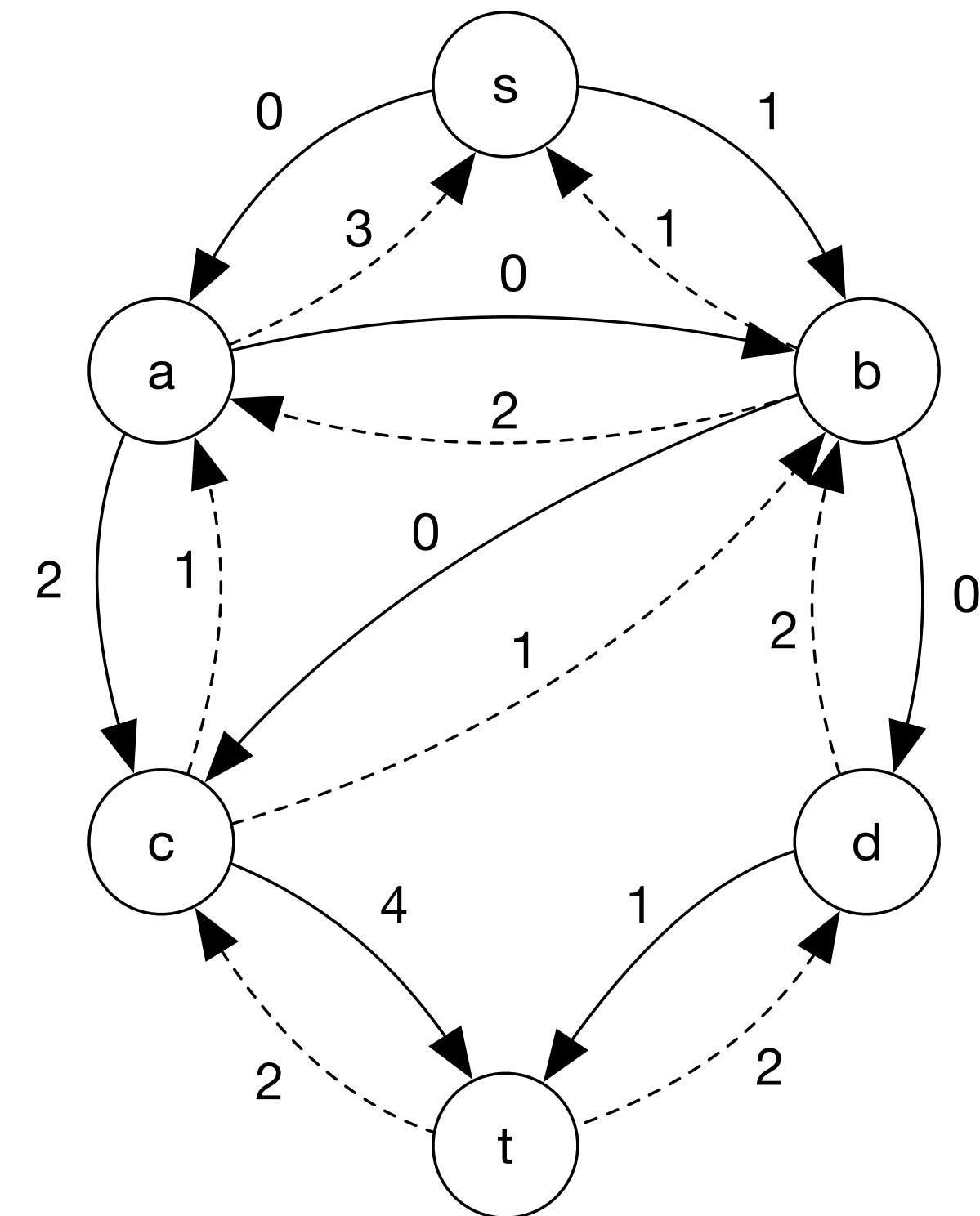
CAPACITY



FLOW

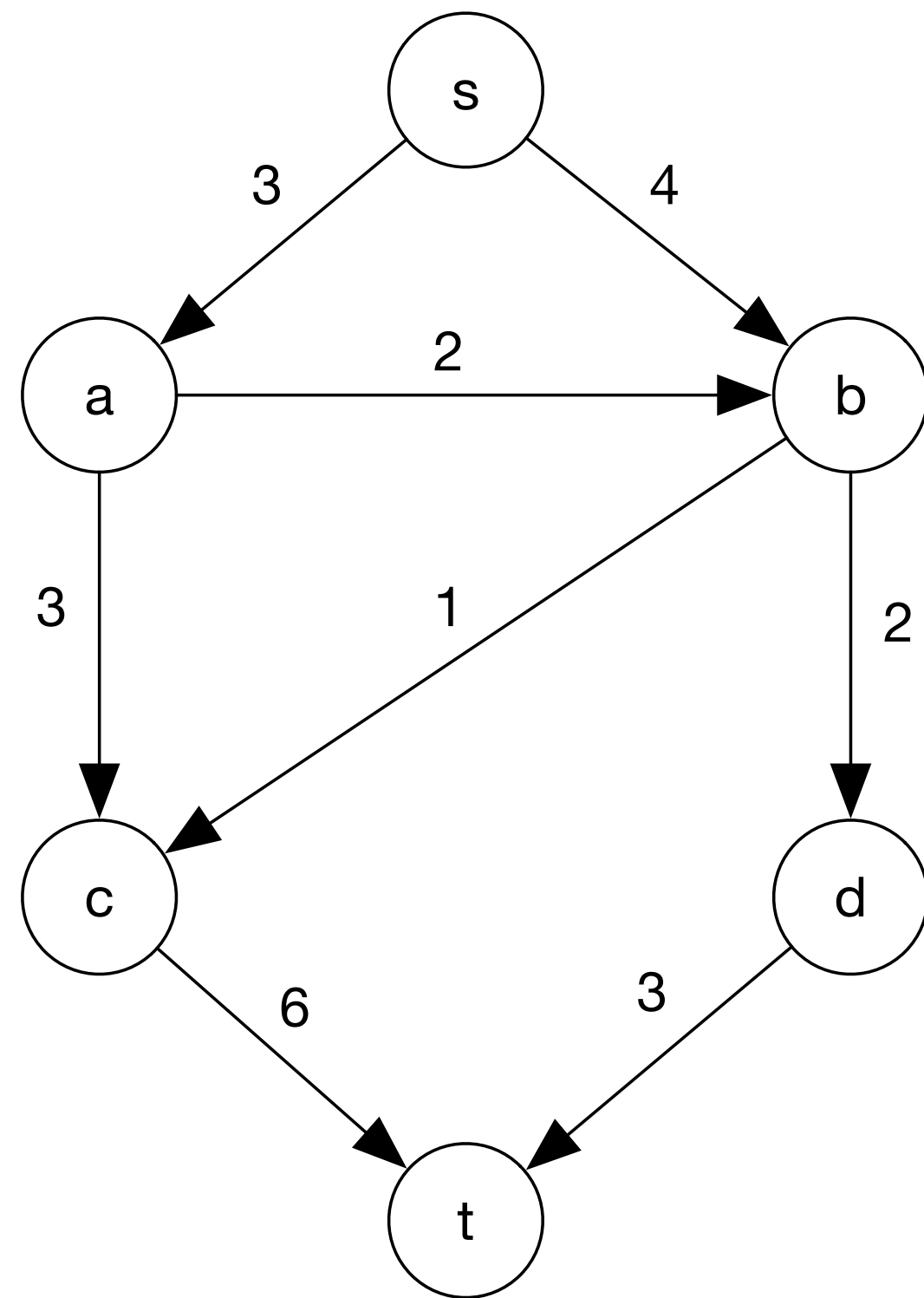


RESIDUAL

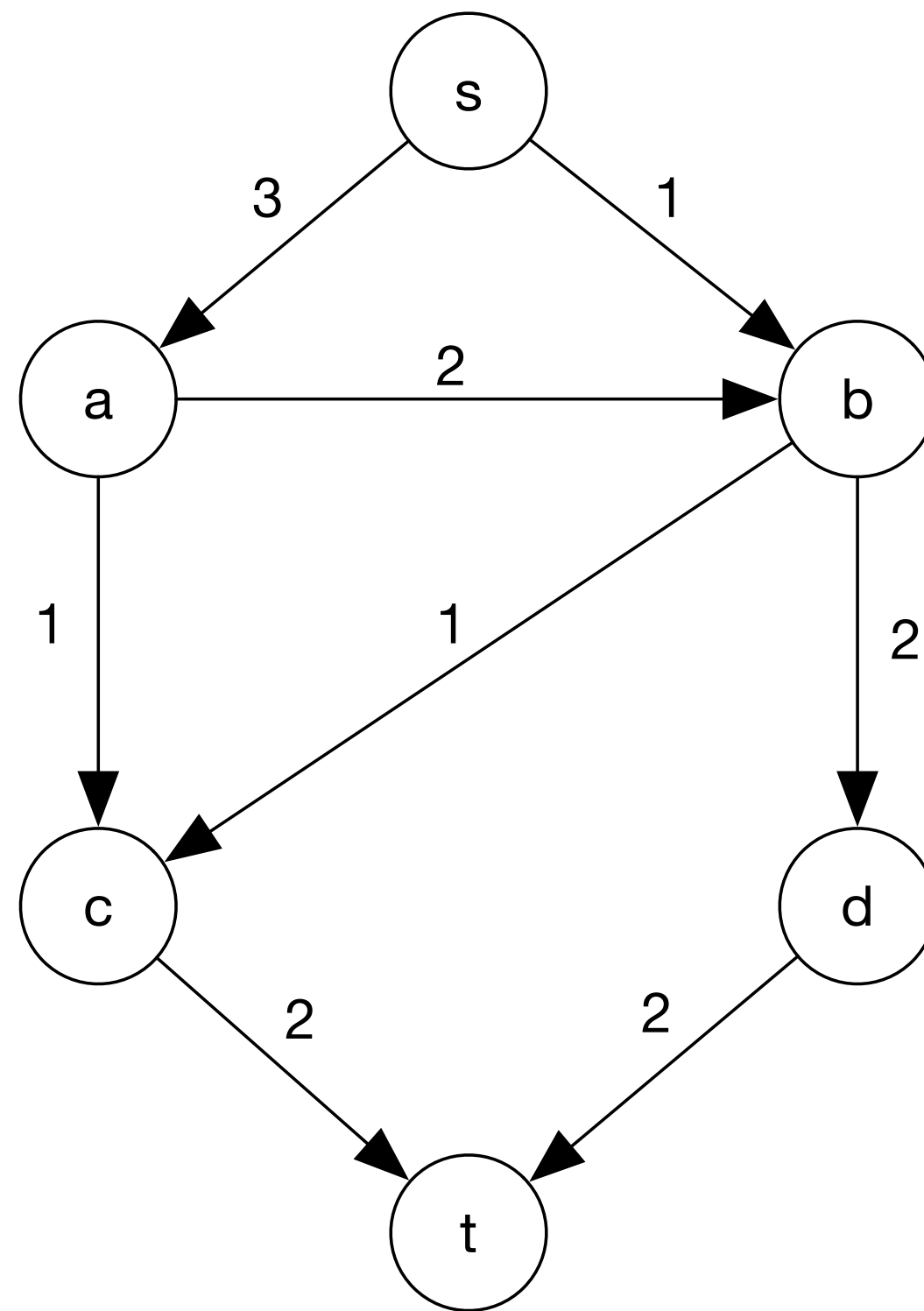


# Network flow

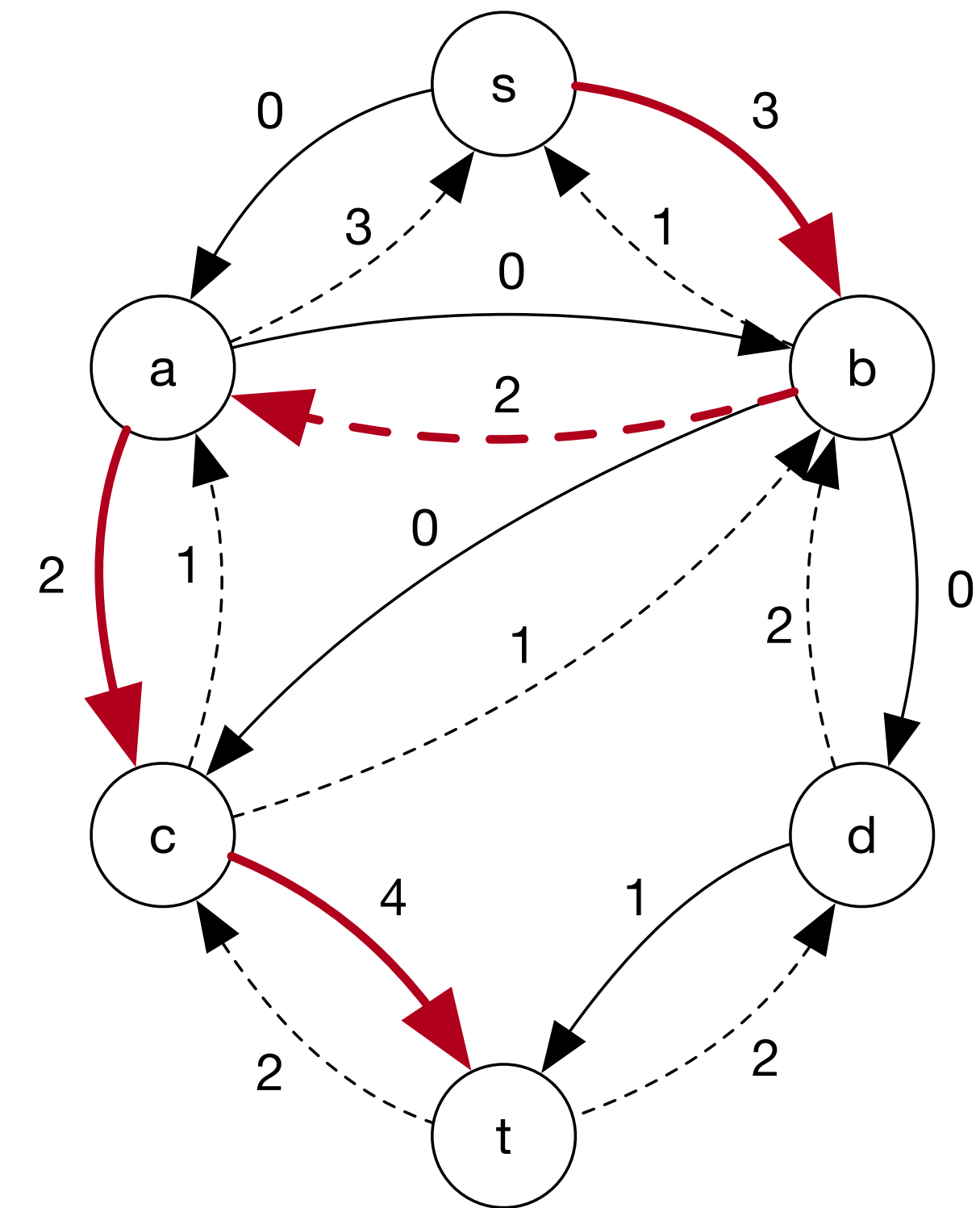
CAPACITY



FLOW



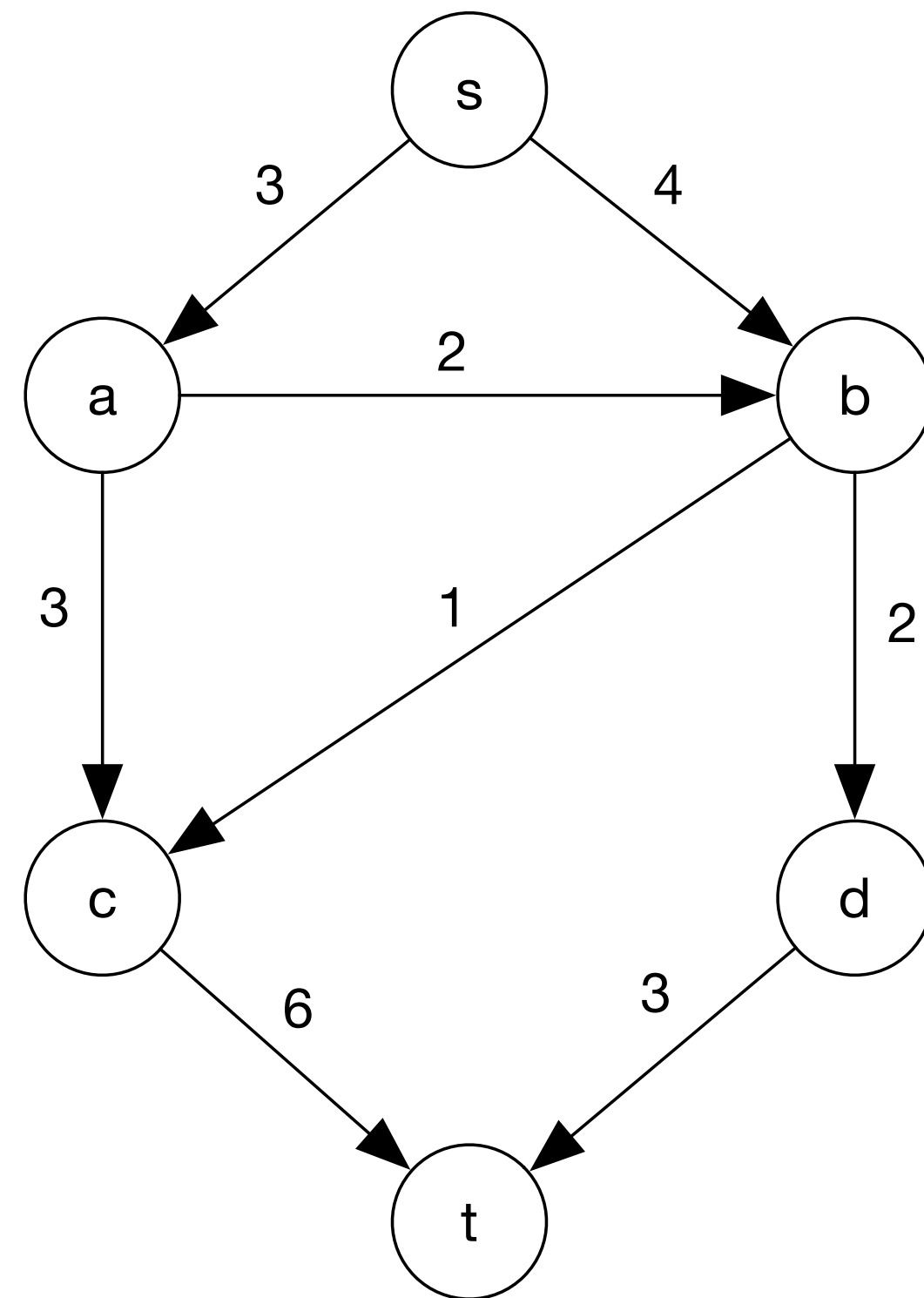
RESIDUAL



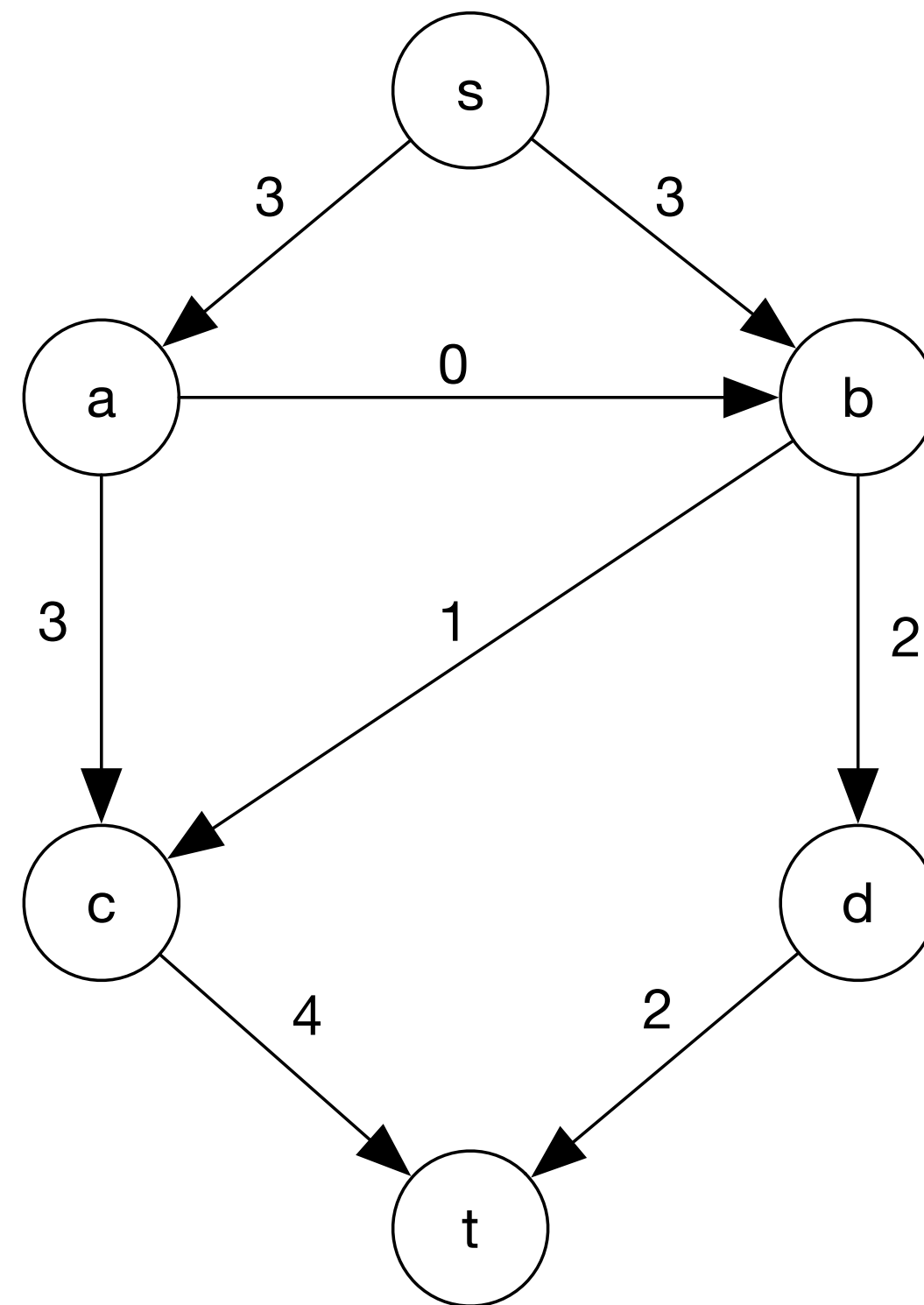


# Network flow

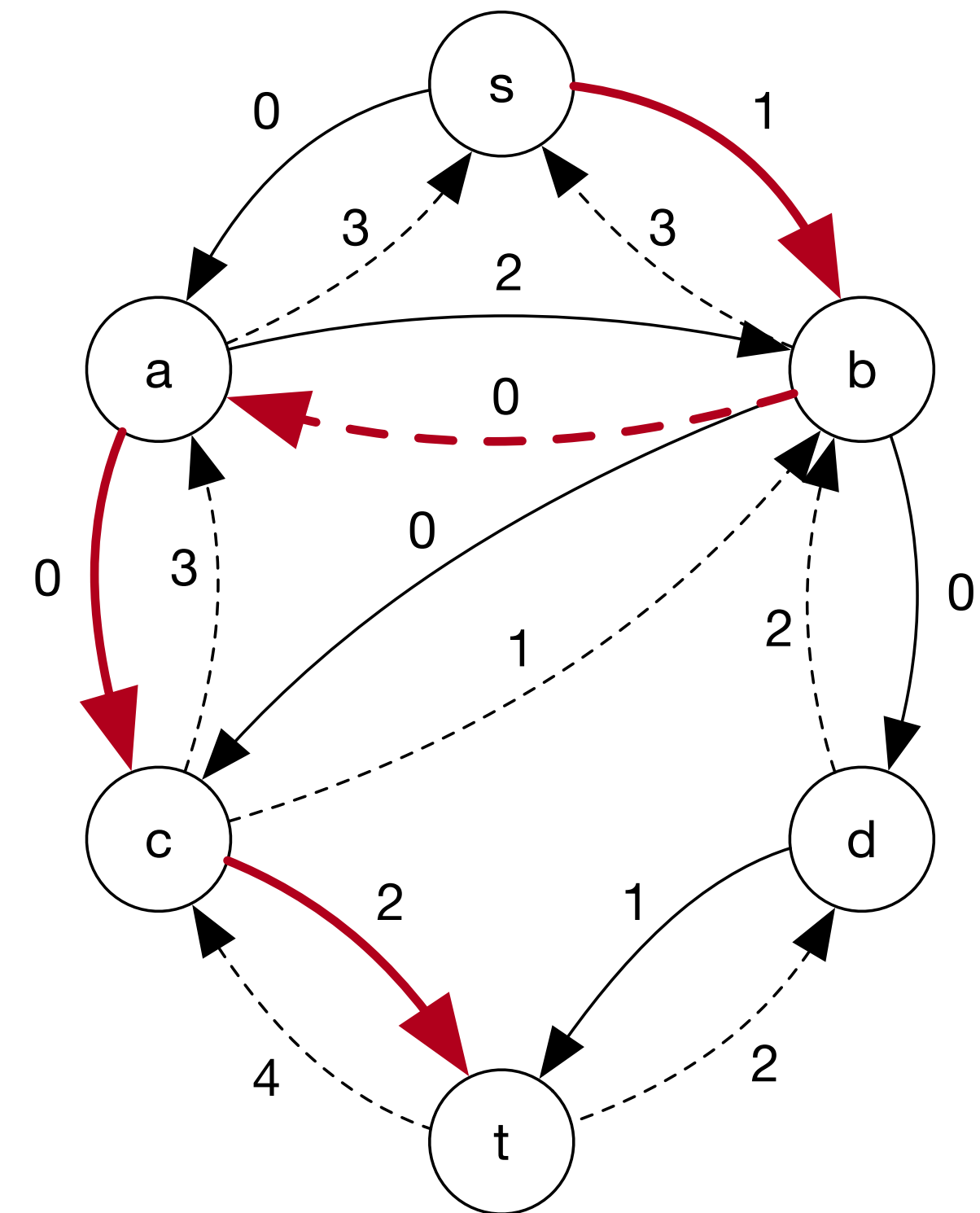
CAPACITY



FLOW

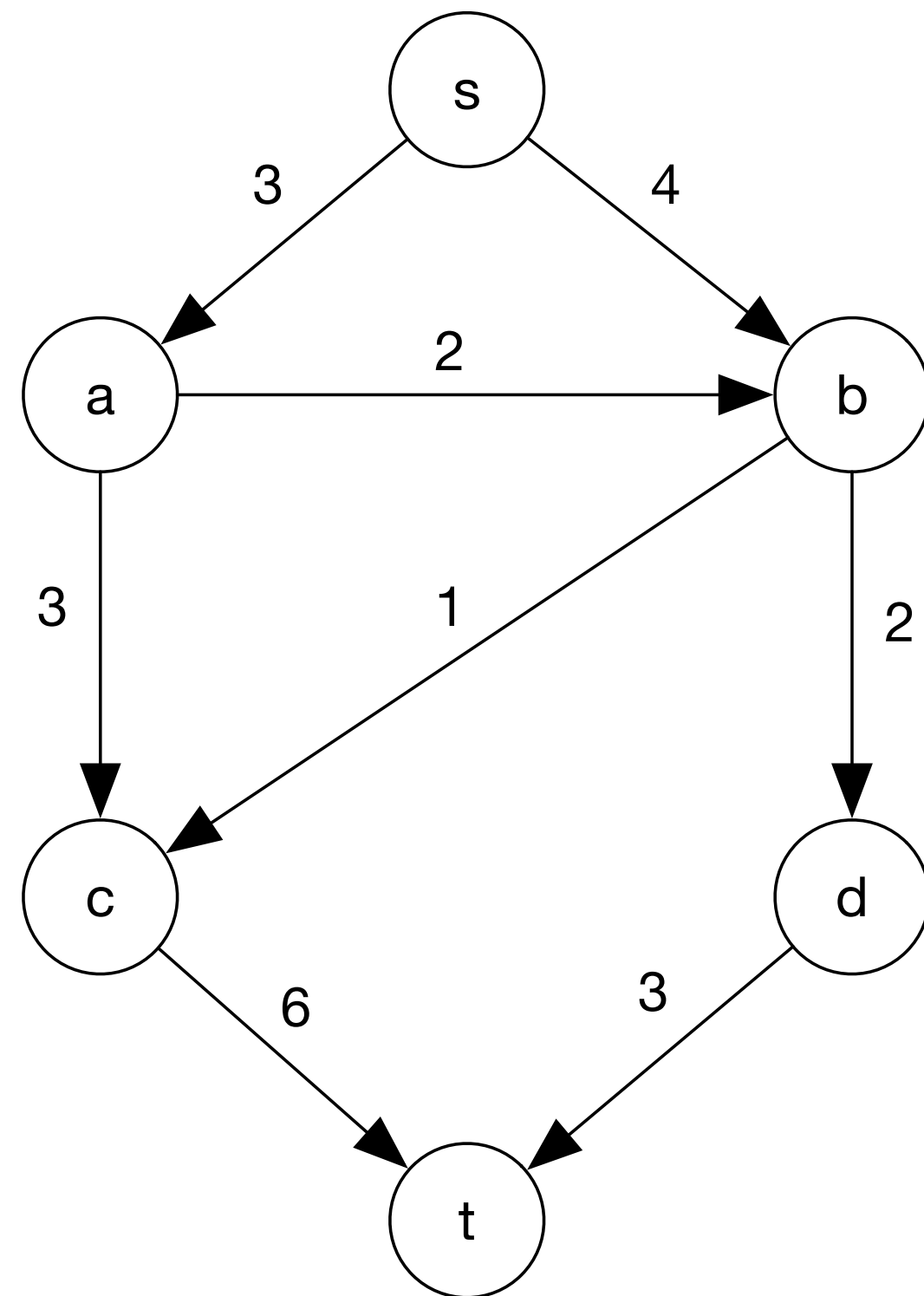


RESIDUAL

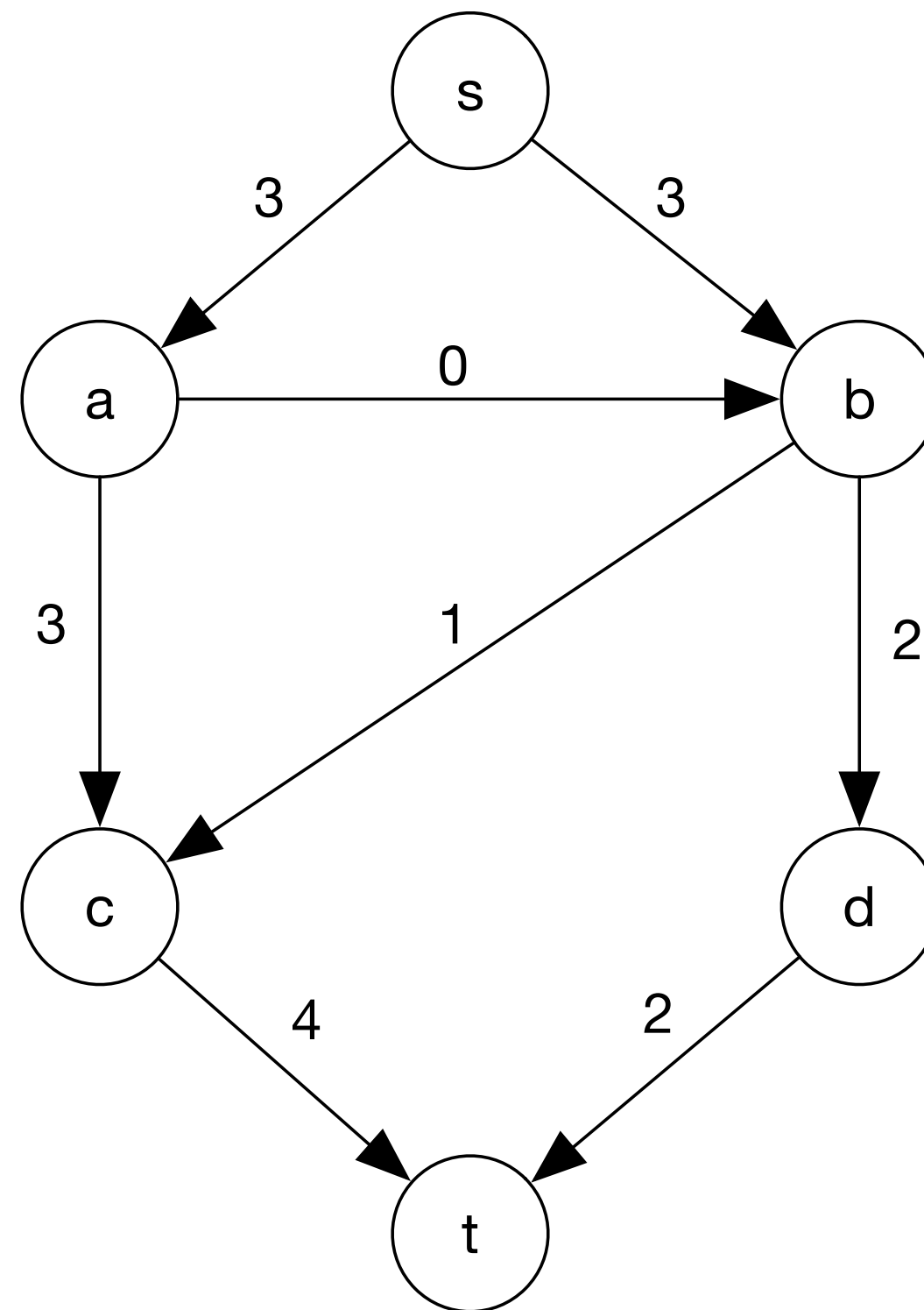


# Network flow

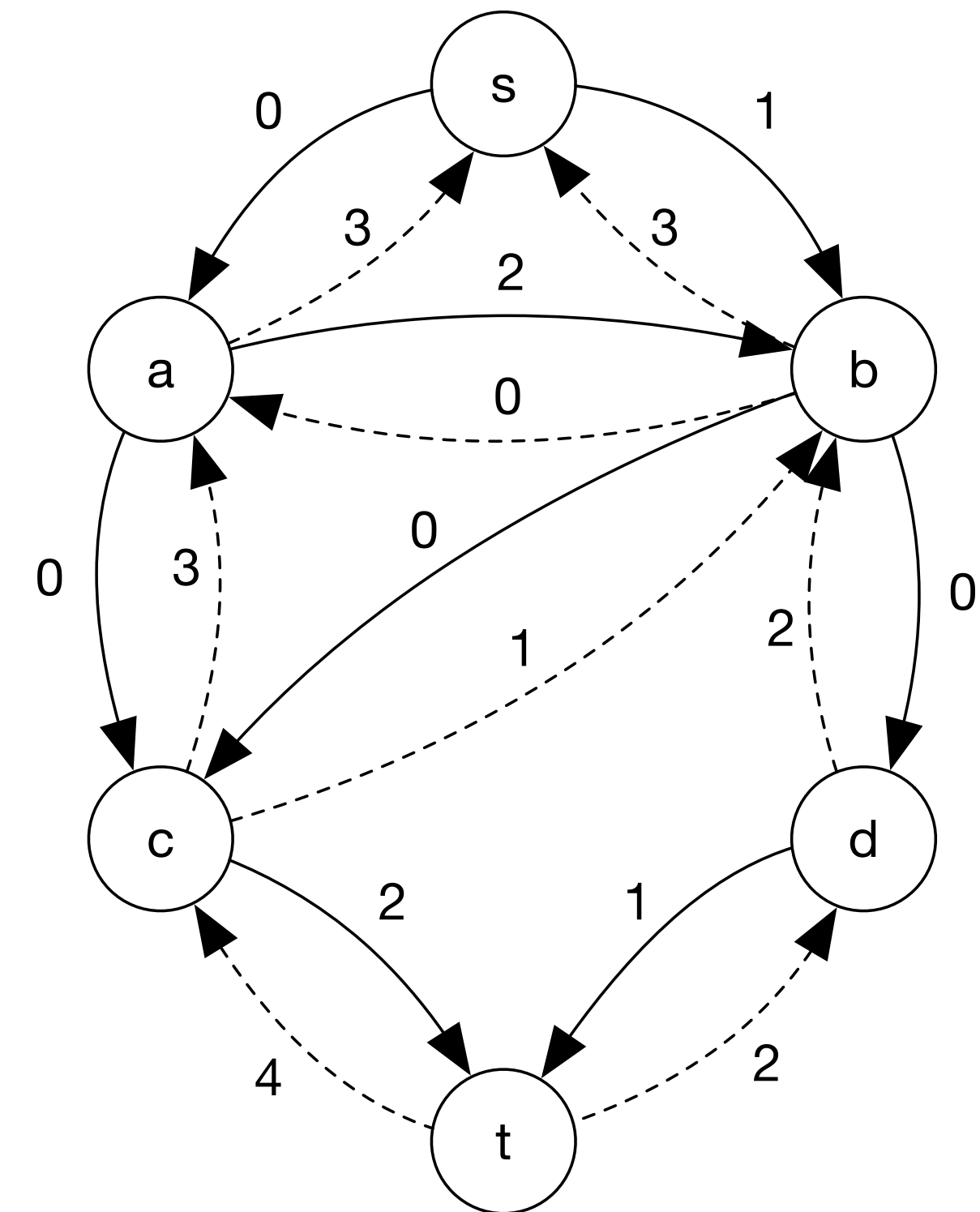
CAPACITY



FLOW



RESIDUAL



# Network flow

## Ford-Fulkerson

- Initialize flow network to all zeros
- Initialize residual network with weights on forward edges to correspond capacities, and weights on backward edges to zero
- While augmenting paths exist in the residual graph
  - Update flow network by adding augmenting flow to corresponding edges
  - Update forward edges in residual network by deducting augmenting flow from corresponding edges
  - Update backward edges in residual network by adding augmenting flow to corresponding edges

# Network flow

Is this a greedy algorithm? Yes!

What's the complexity?  $\mathcal{O}(|E|f)$

How do we find augmenting paths? It depends.

# Network flow

Is this a greedy algorithm? Yes!

What's the complexity?  $\mathcal{O}(|E|f)$

How do we find augmenting paths? It depends.

- If we use breadth-first search, this is called Edmonds-Karp algorithm
- Worst case complexity of Edmonds-Karp  $\mathcal{O}(|V| \times |E|^2)$

# Network flow

What we haven't discussed:

- Reals: rational- and irrational-valued capacities
- Proof of correctness
- Special applications of network flow (*i.e.*, bipartite matching)