

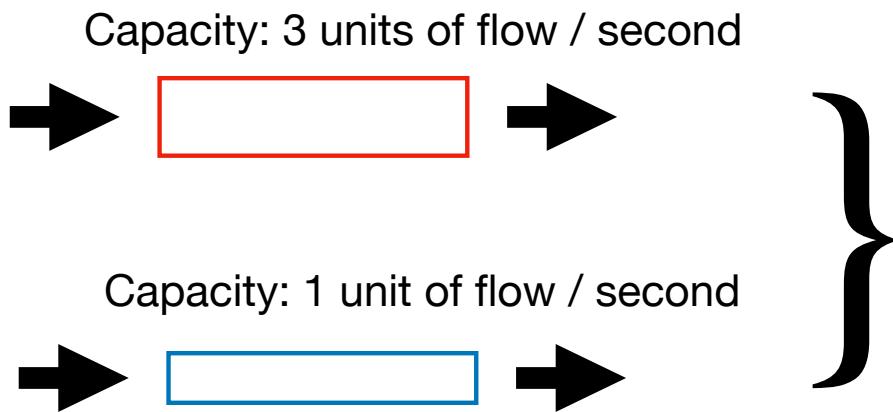
# **Algorithms**

## **Lecture 21: Maximum Flow (Part 1)**

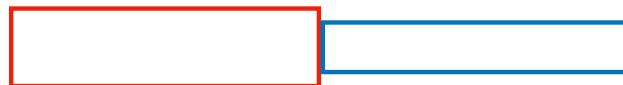
**Anxiao (Andrew) Jiang**

## CH 26. Maximum Flow

Capacity of a flow “pipe”

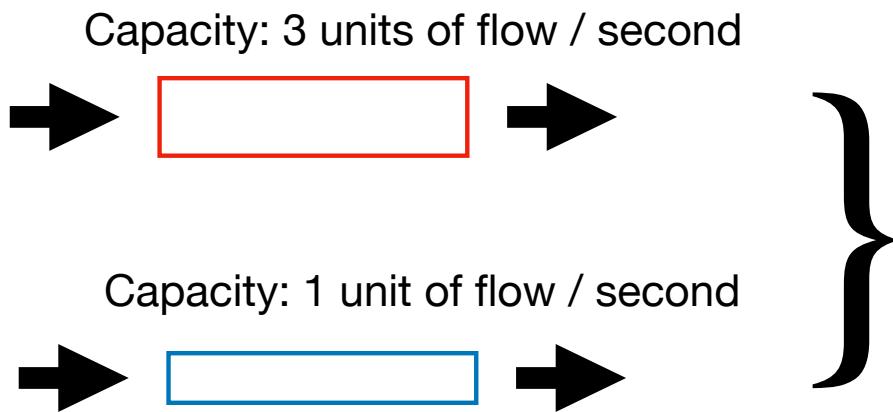


What is its overall capacity?

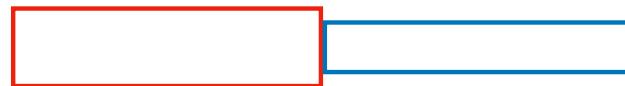


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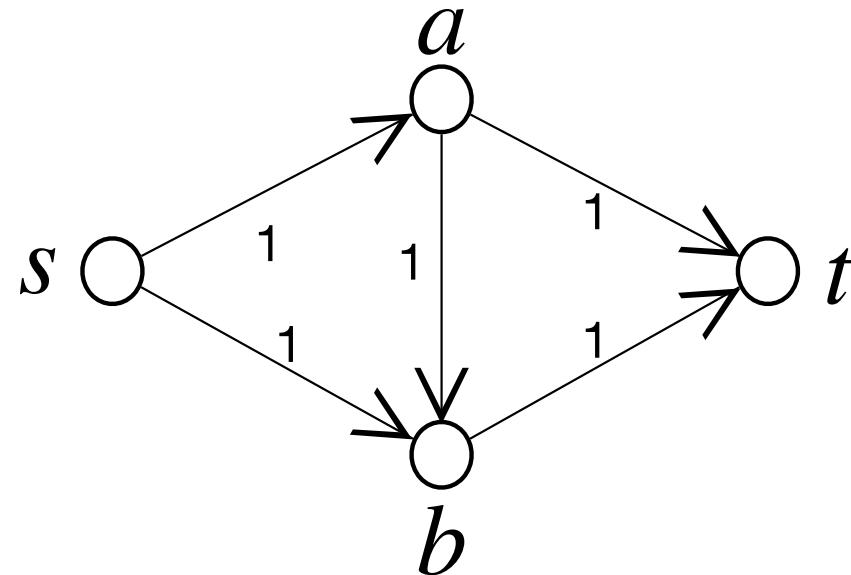
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$$\min\{3,1\} = 1$$

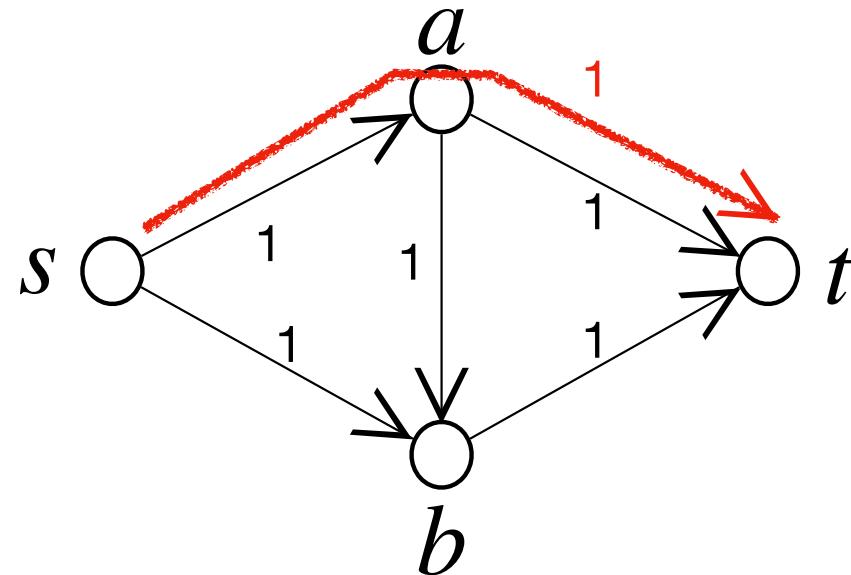
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How much flow can be transmitted from s to t,  
assuming every edge has capacity 1?



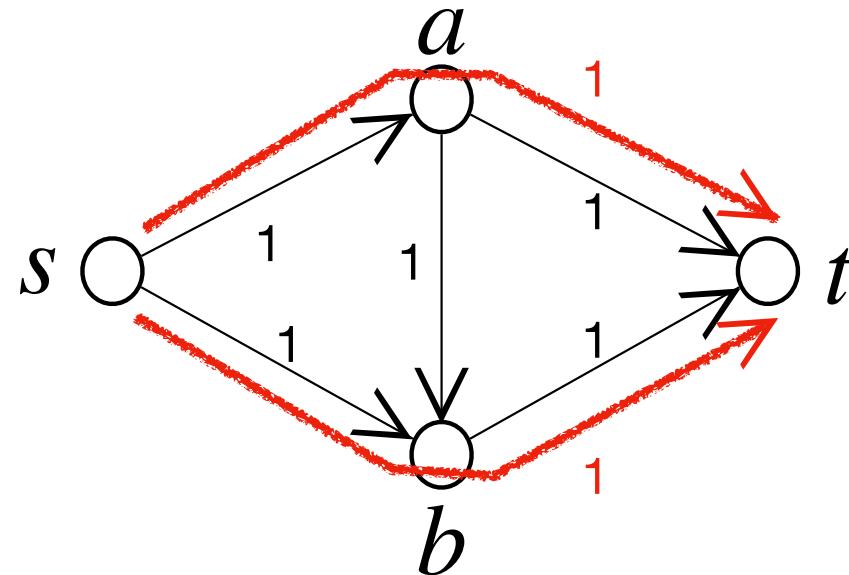
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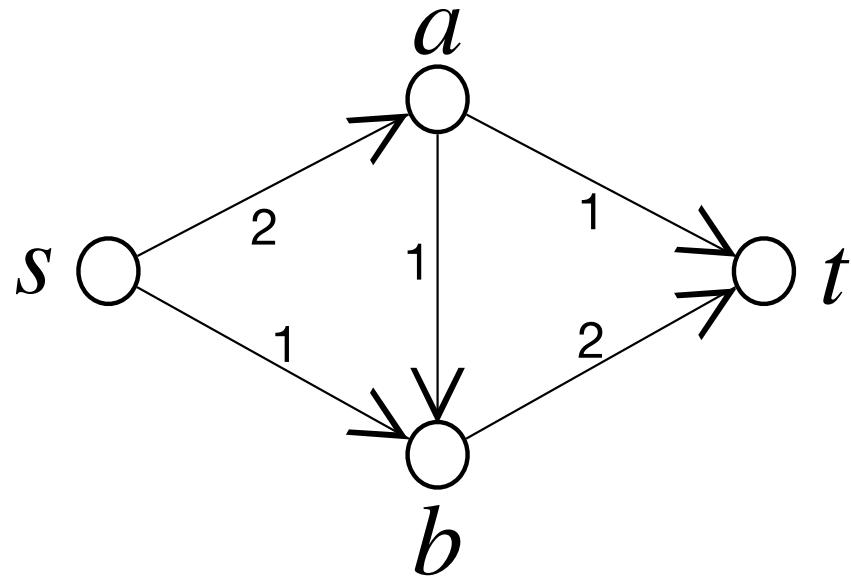


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2

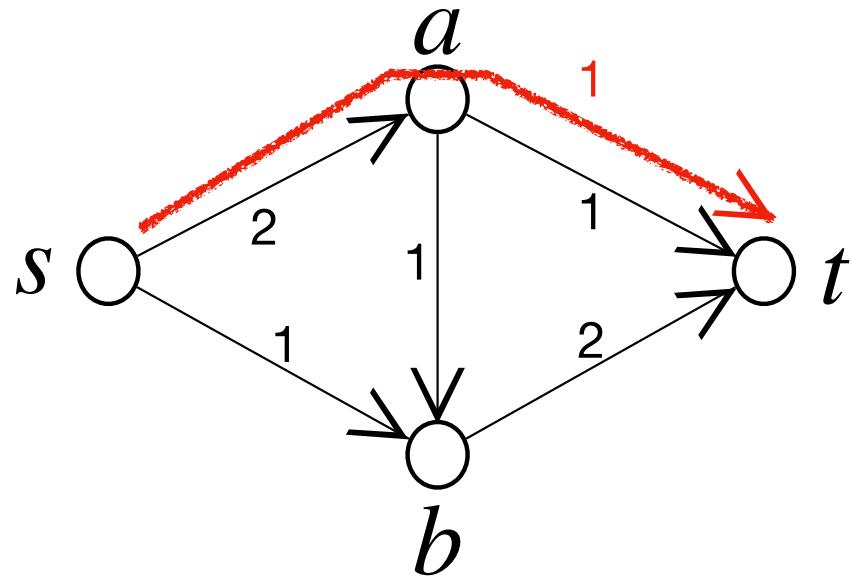
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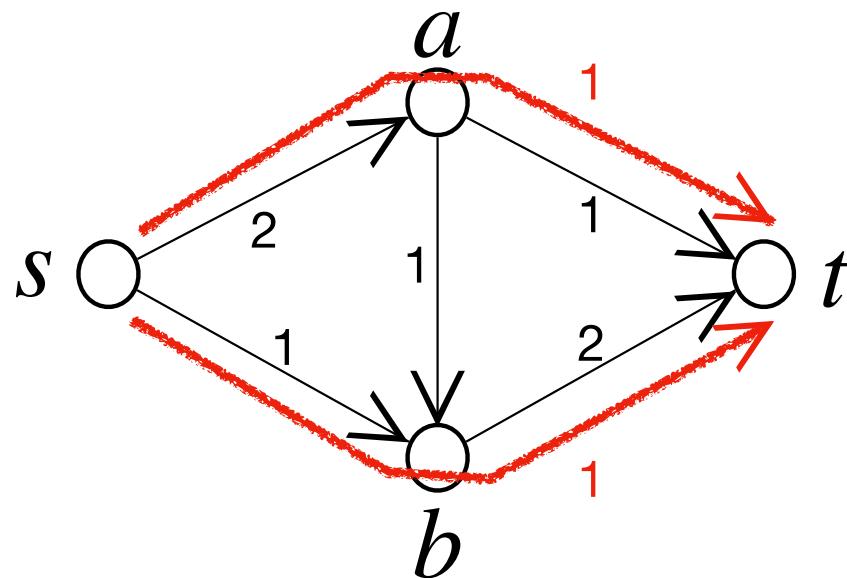
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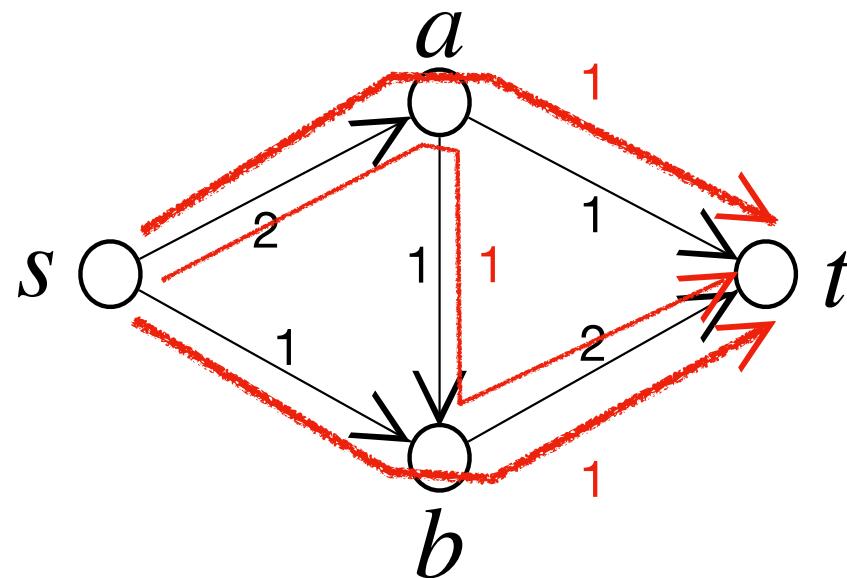
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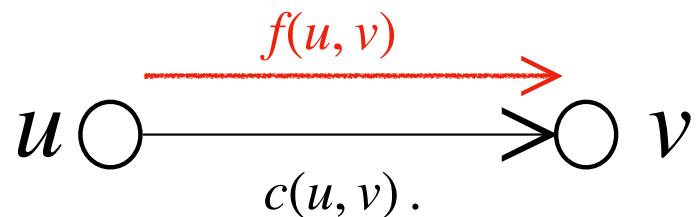
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## CH 26. Maximum Flow

**Input:** A directed graph  $G=(V,E)$ , where every edge  $(u,v) \in E$  has a non-negative capacity  $c(u,v)$ . Let  $s \in V$  be a “source” node, and let  $t \in V$  be a “sink” node.

**Flow:**  $\forall (u,v) \in E$ , let  $f(u,v)$  be the flow from  $u$  to  $v$  in the edge  $(u,v)$ .



**Capacity constraint:**  $0 \leq f(u,v) \leq c(u,v)$

## CH 26. Maximum Flow

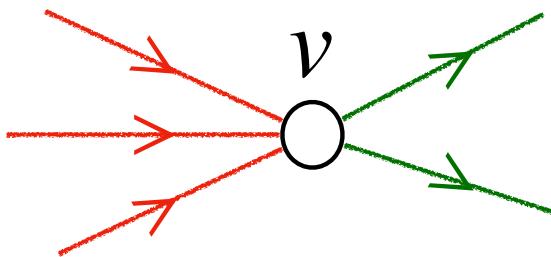
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Constraints for flow  $f$ :

1) Capacity constraint:  $\forall (u, v) \in E, 0 \leq f(u, v) \leq c(u, v)$

2) Flow-conservation constraint (also called “in-flow equals out-flow” constraint):

For every node that is not source  $s$  or sink  $t$ ,  
its total incoming flow equals its total outgoing flow.



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**Output:** A maximum flow from  $s$  to  $t$ .

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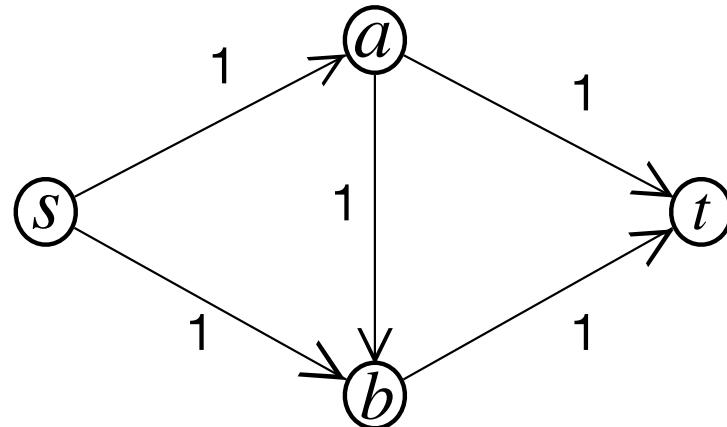
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Each time, look at the network with the residual capacities (i.e., “remaining capacities”), and find a path from  $s$  to  $t$  using only residual capacities, then add as much flow as possible along that path.

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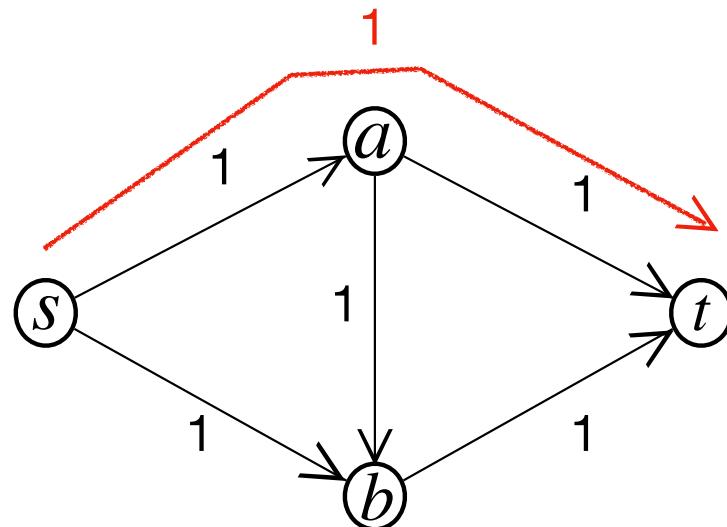
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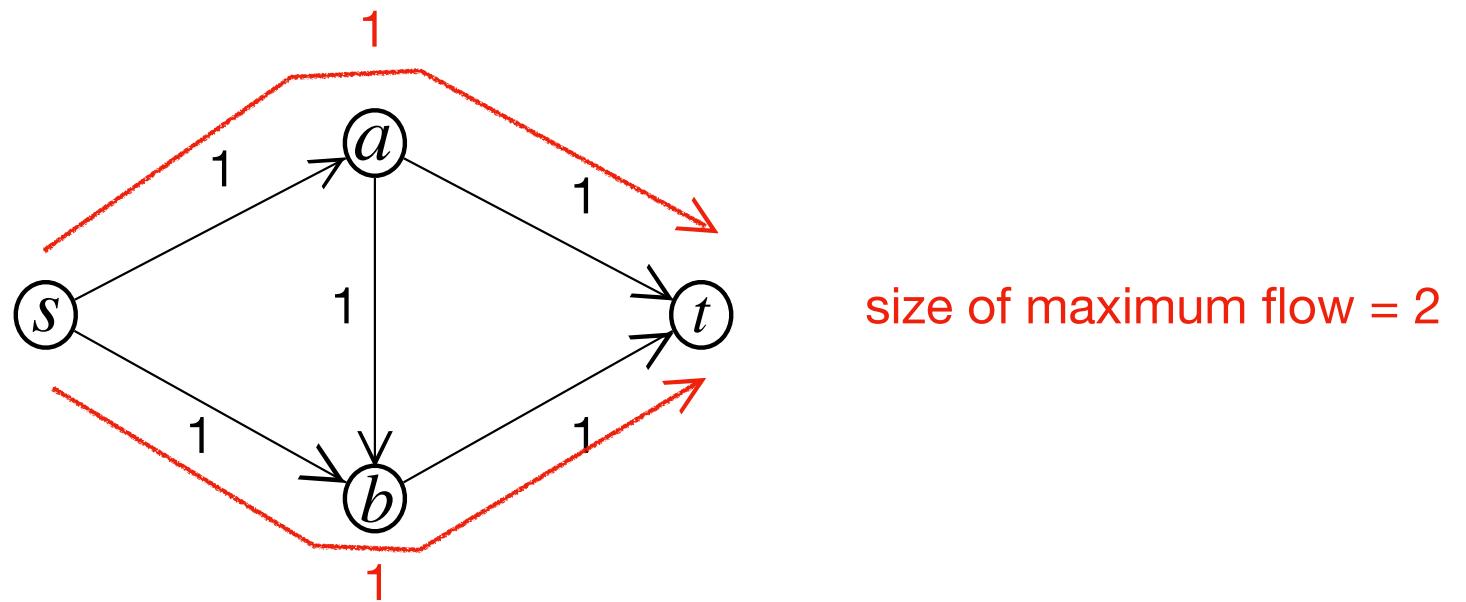
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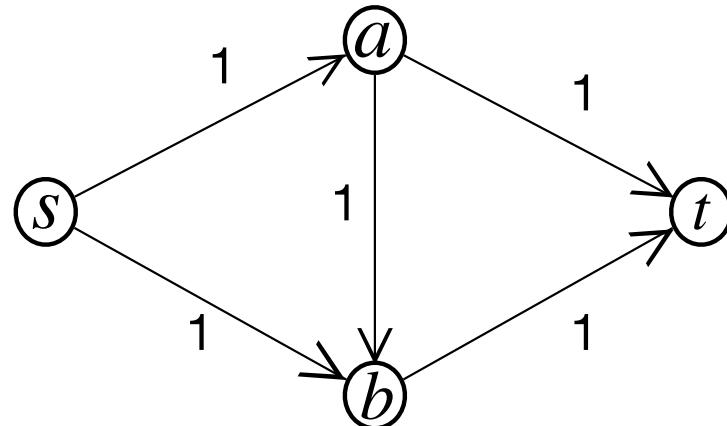


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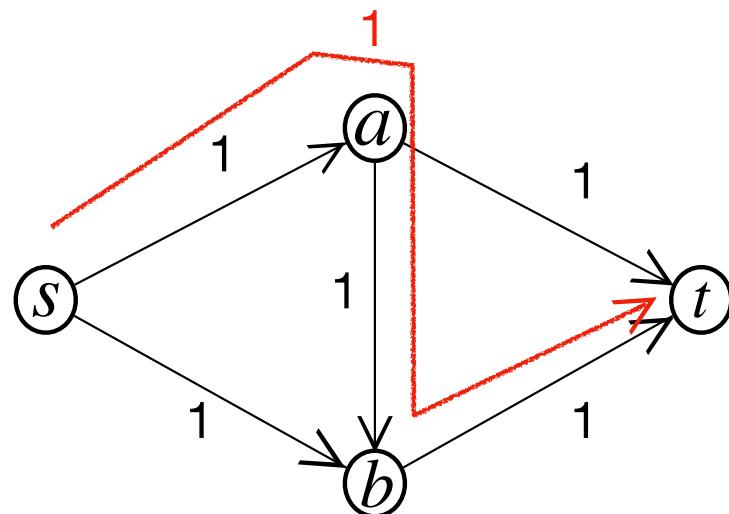


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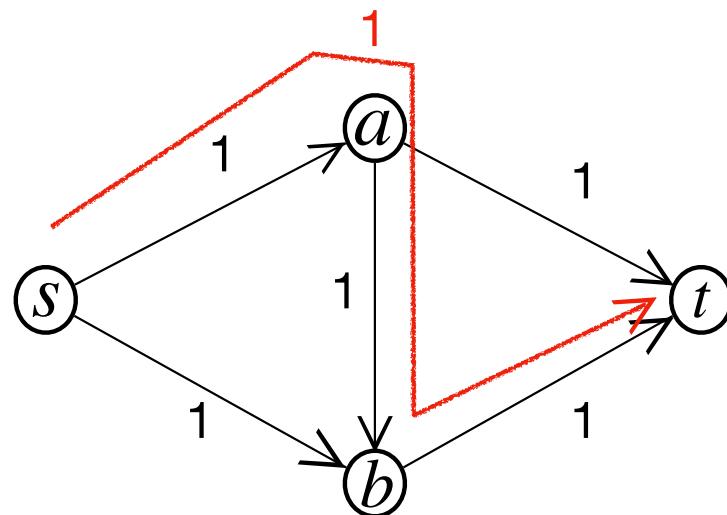
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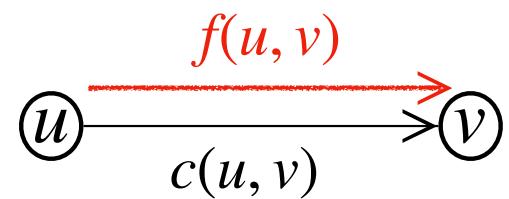


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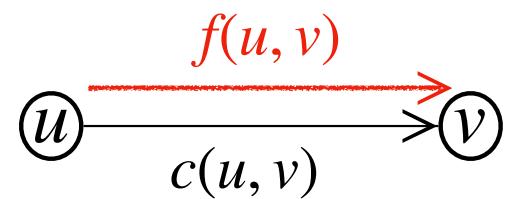
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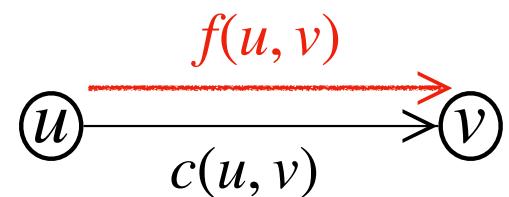


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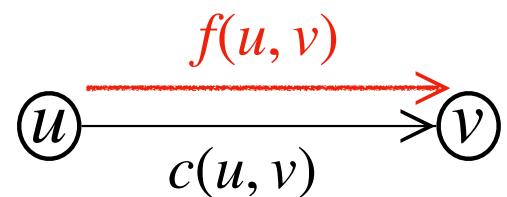
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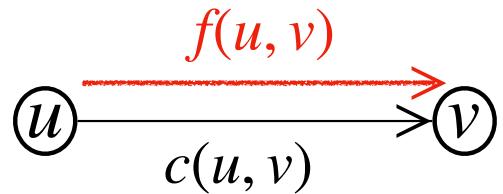
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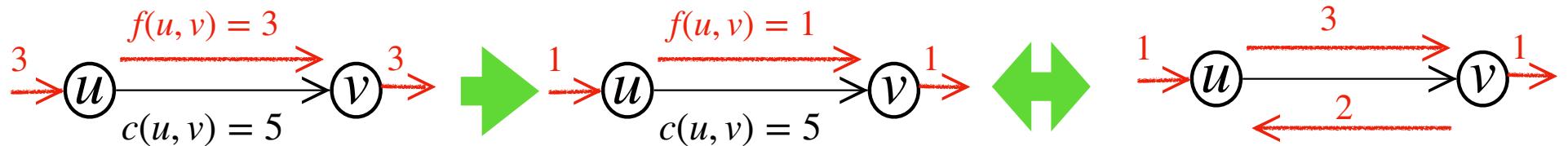
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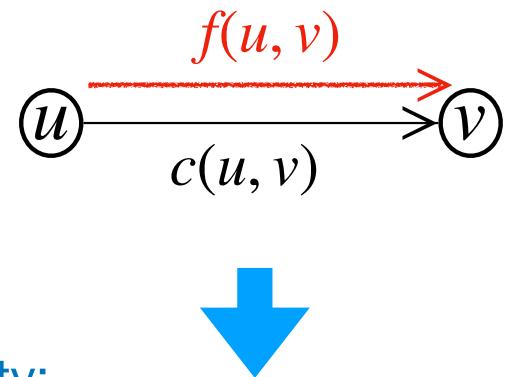
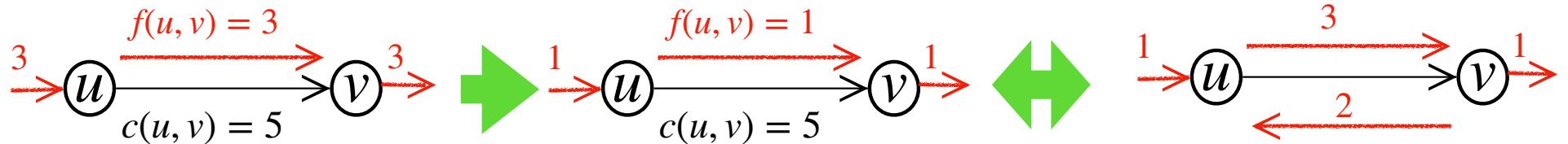
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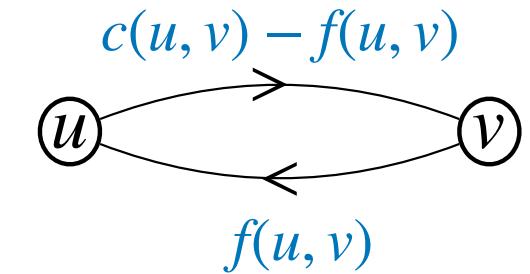
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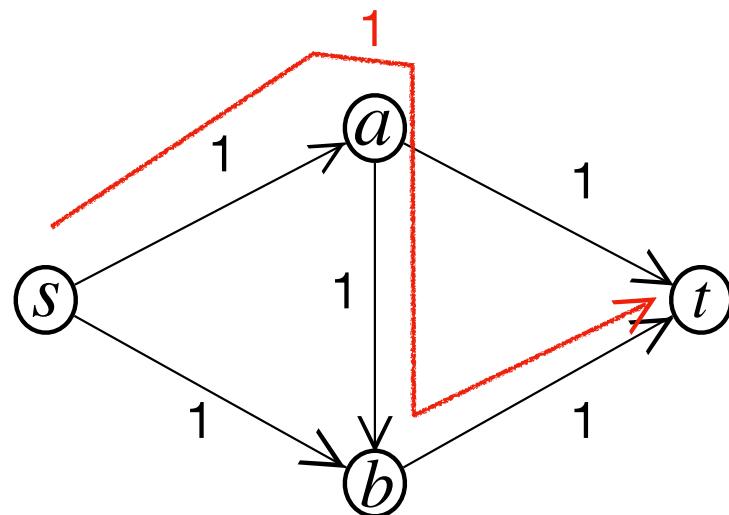


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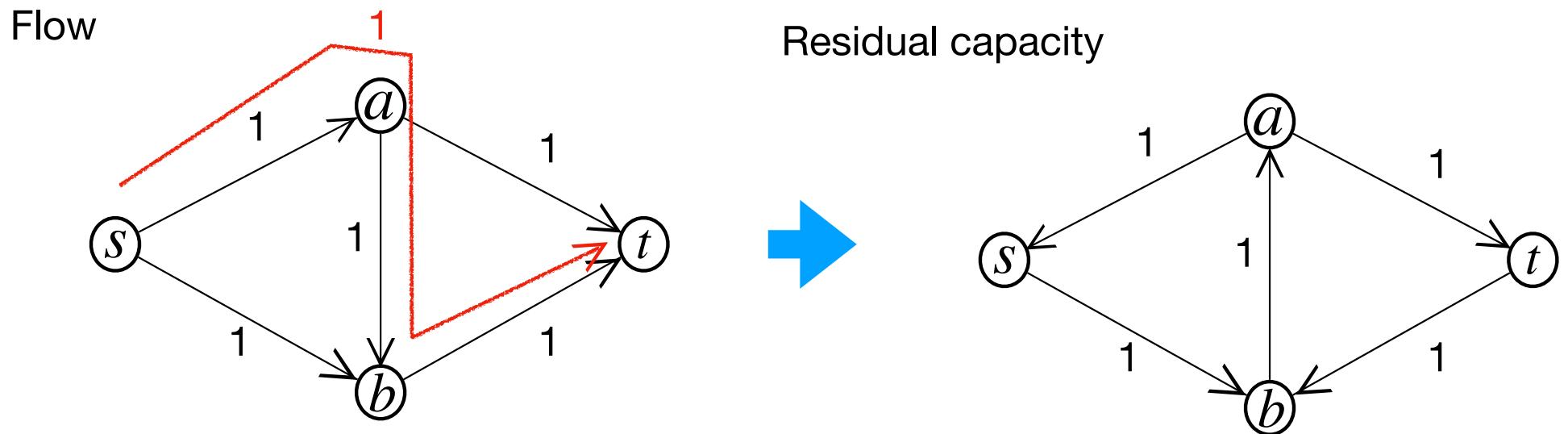
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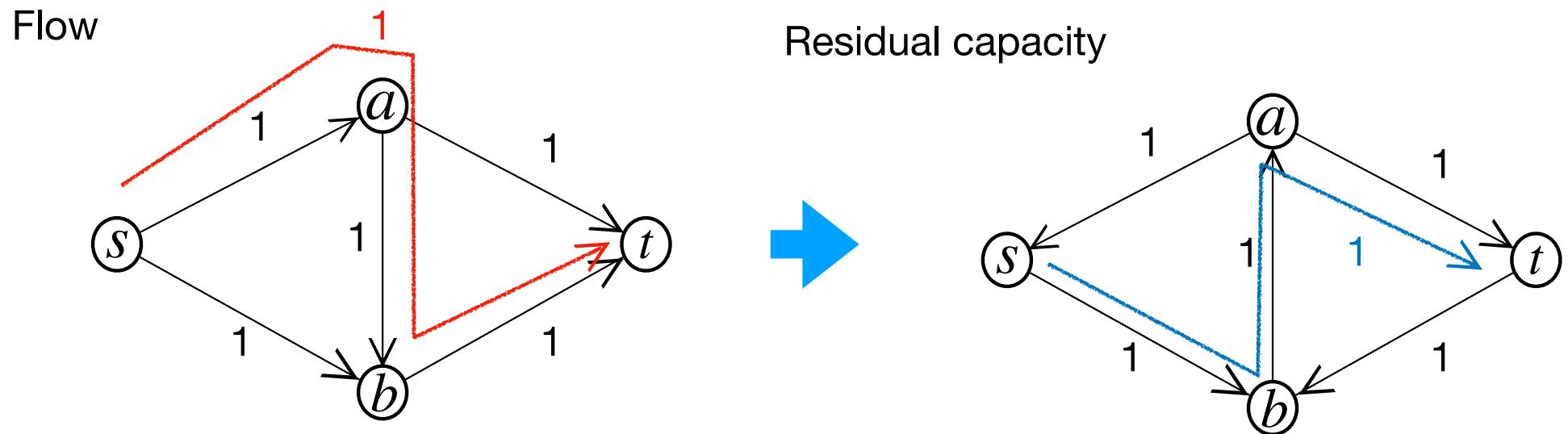
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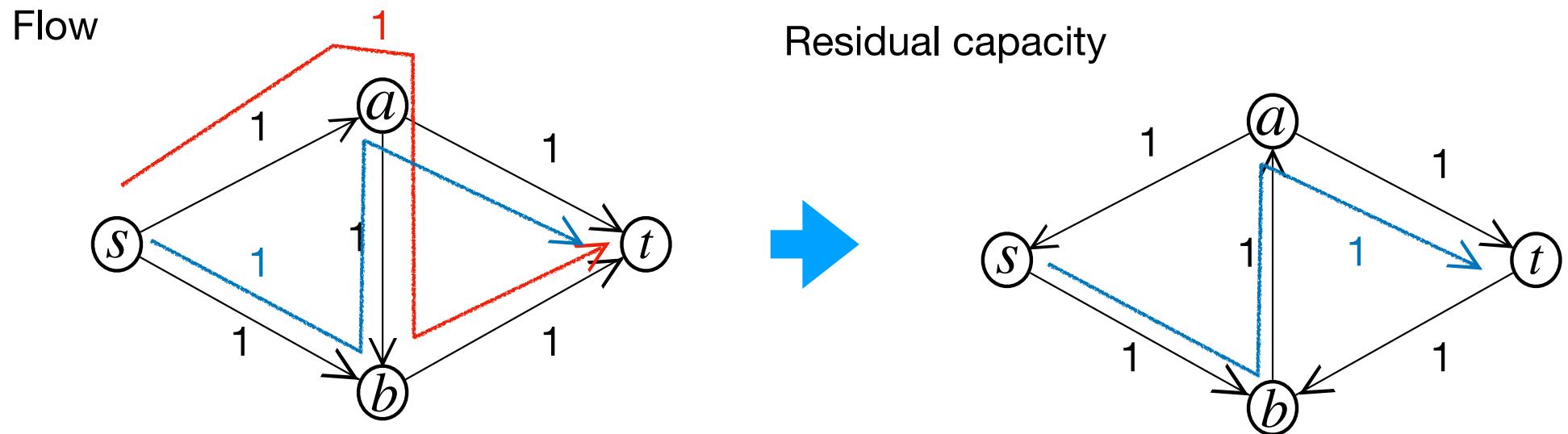
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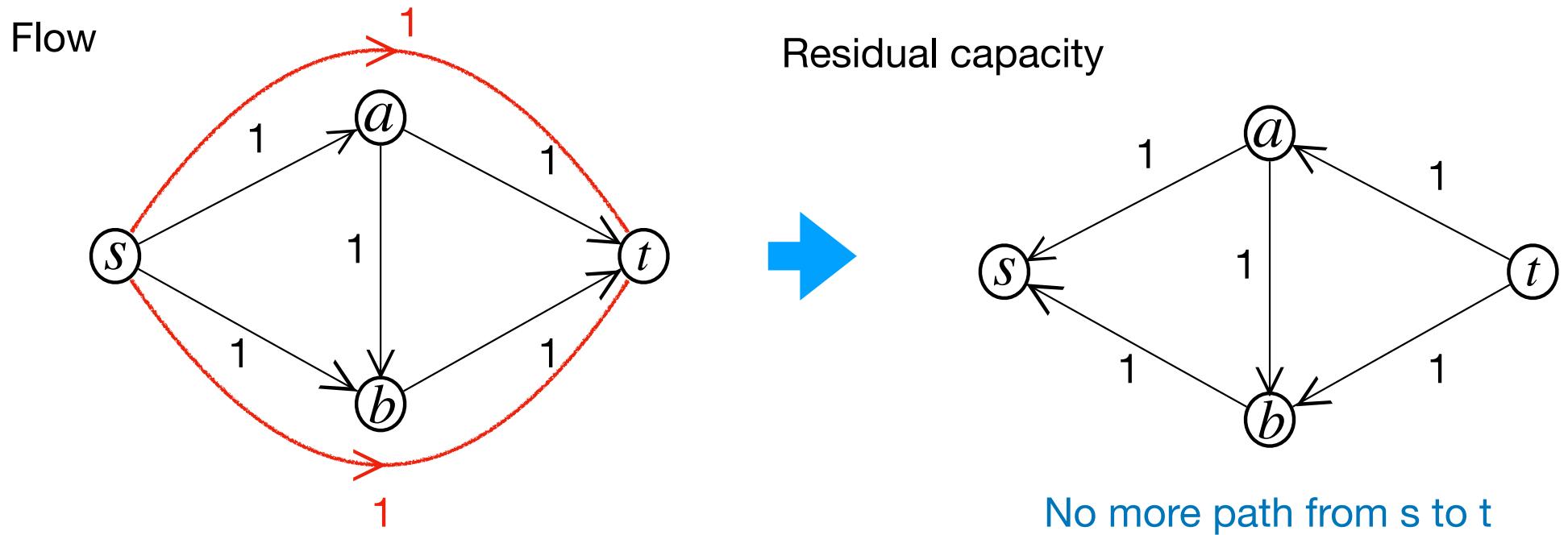
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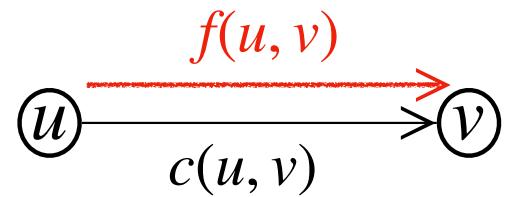


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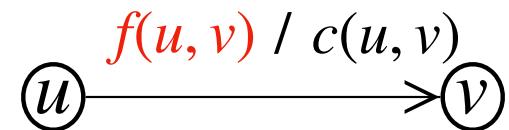
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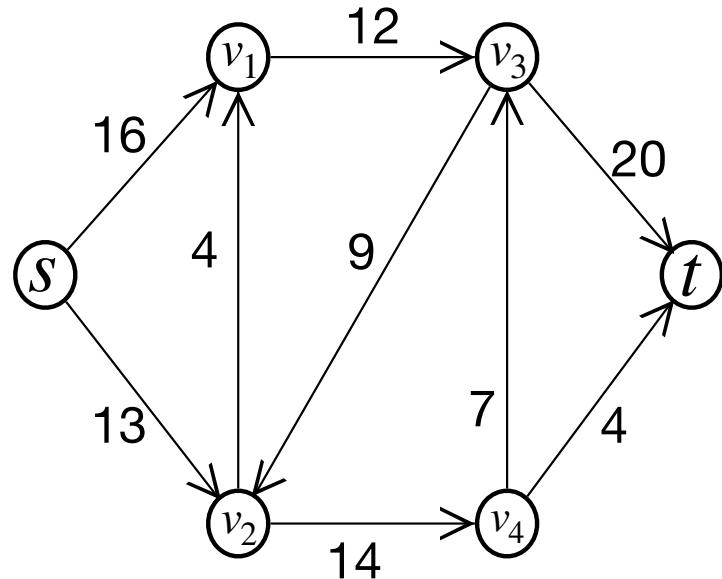


Simpler notation:



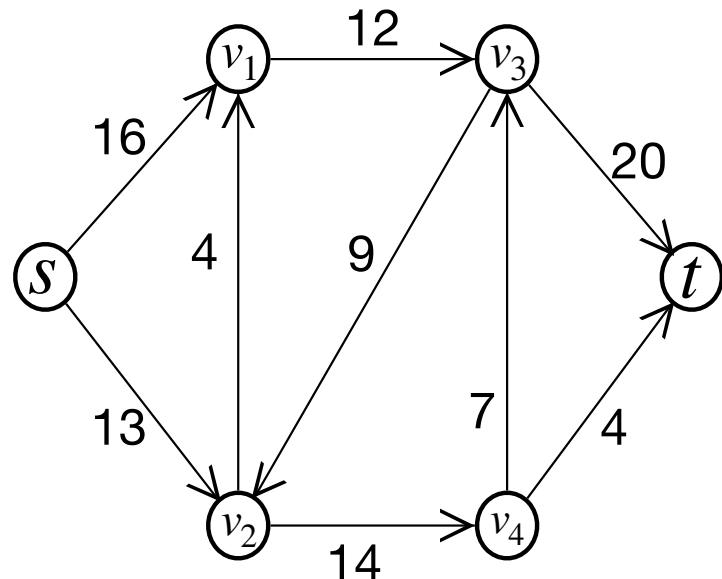
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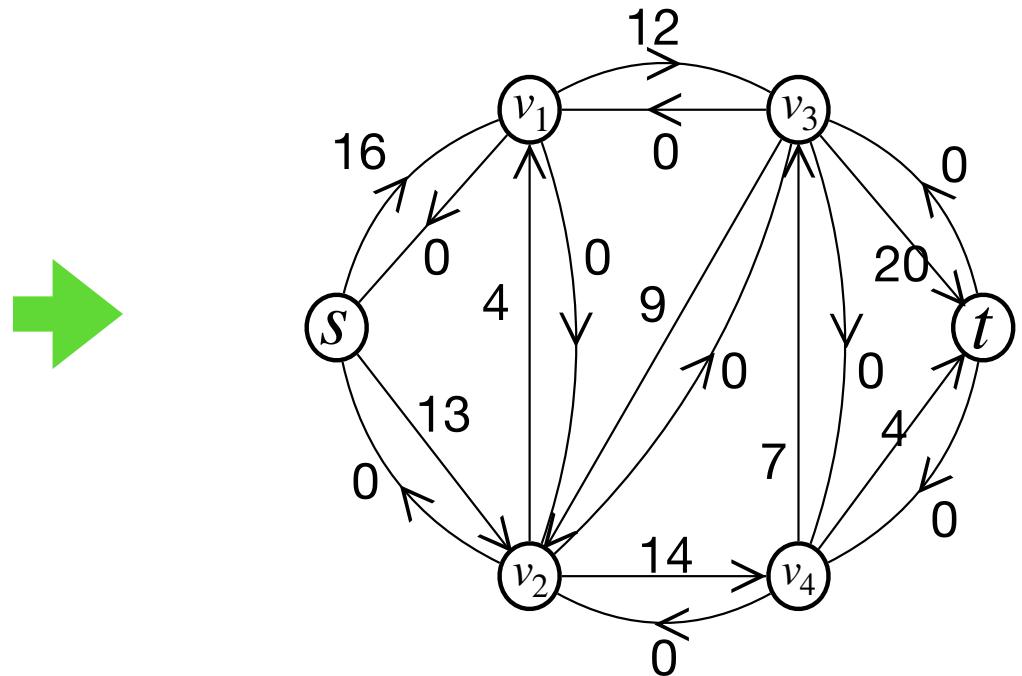


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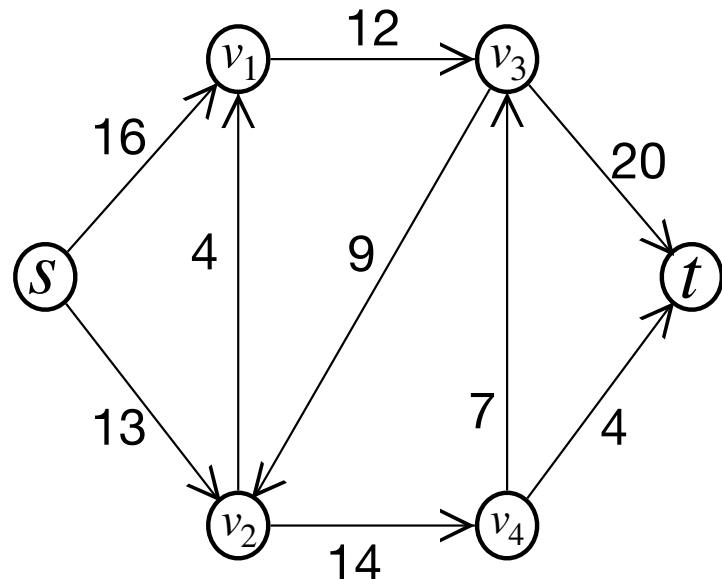


Residual network

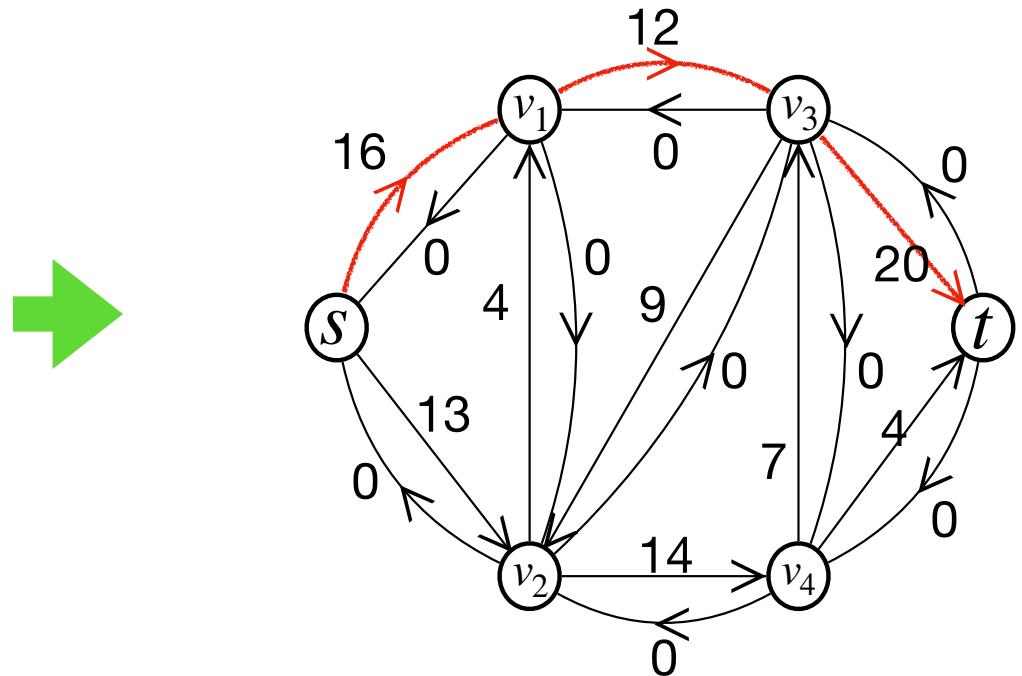


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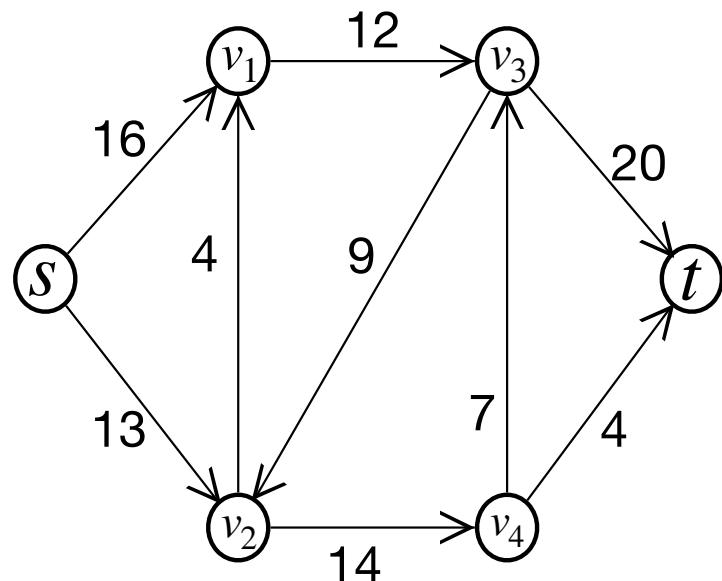


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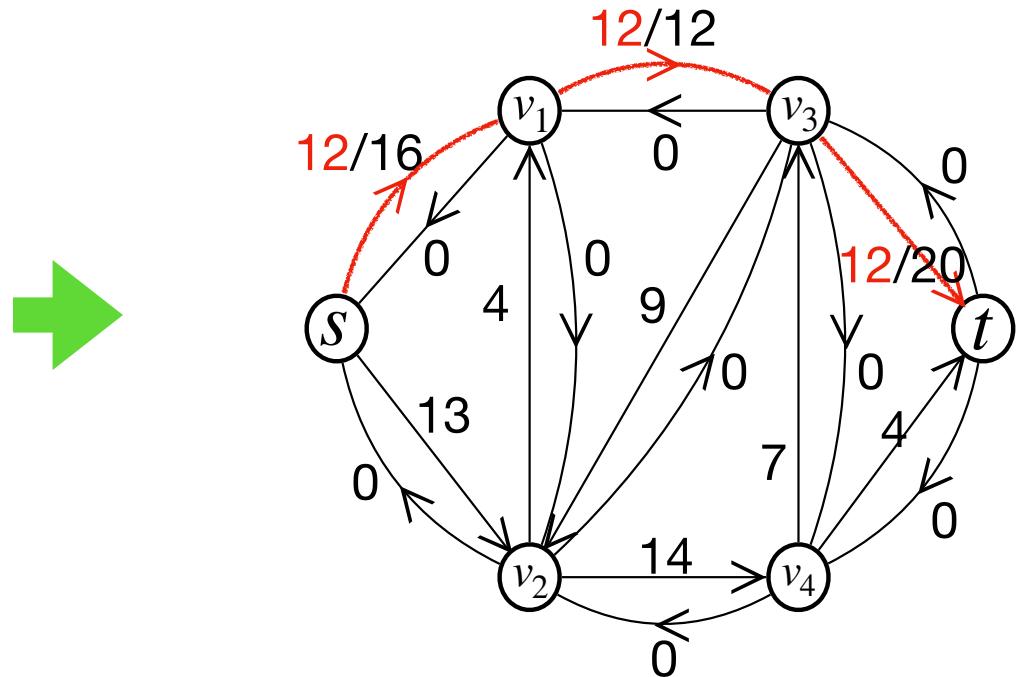


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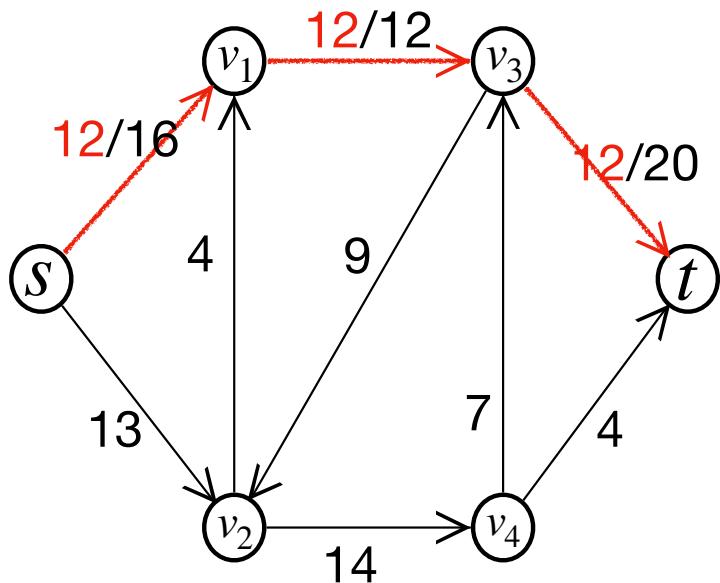


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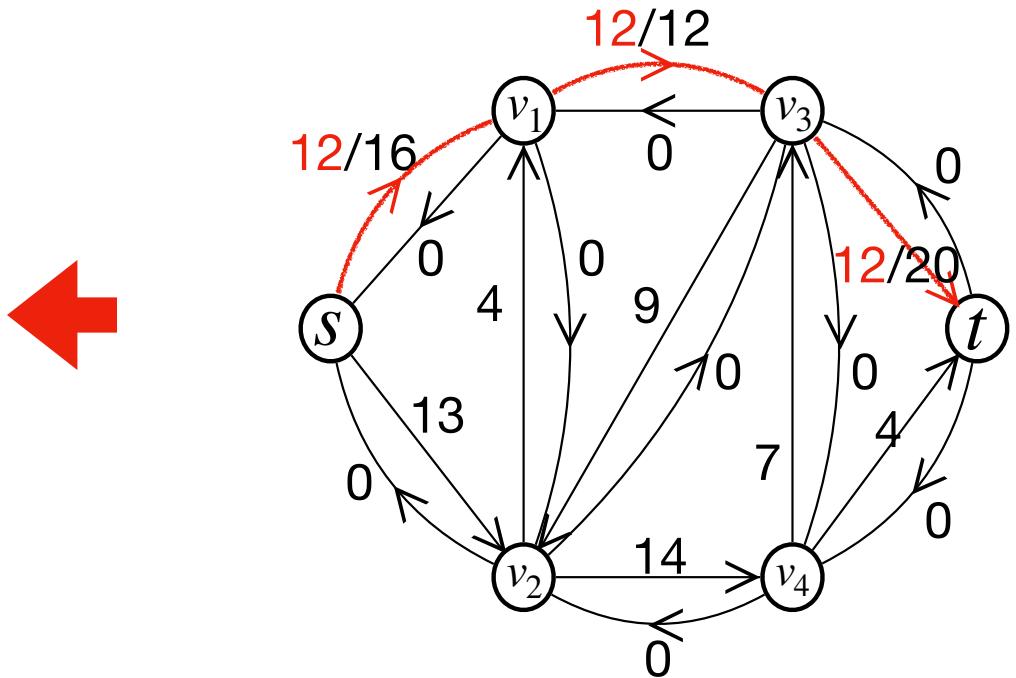


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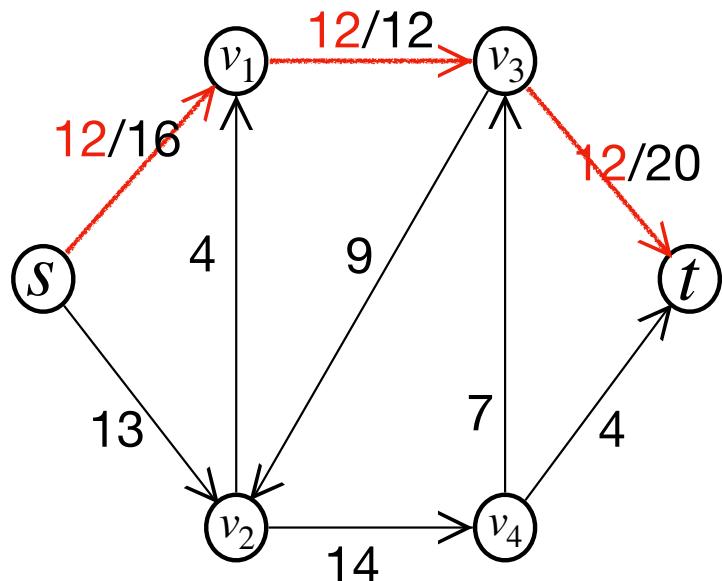


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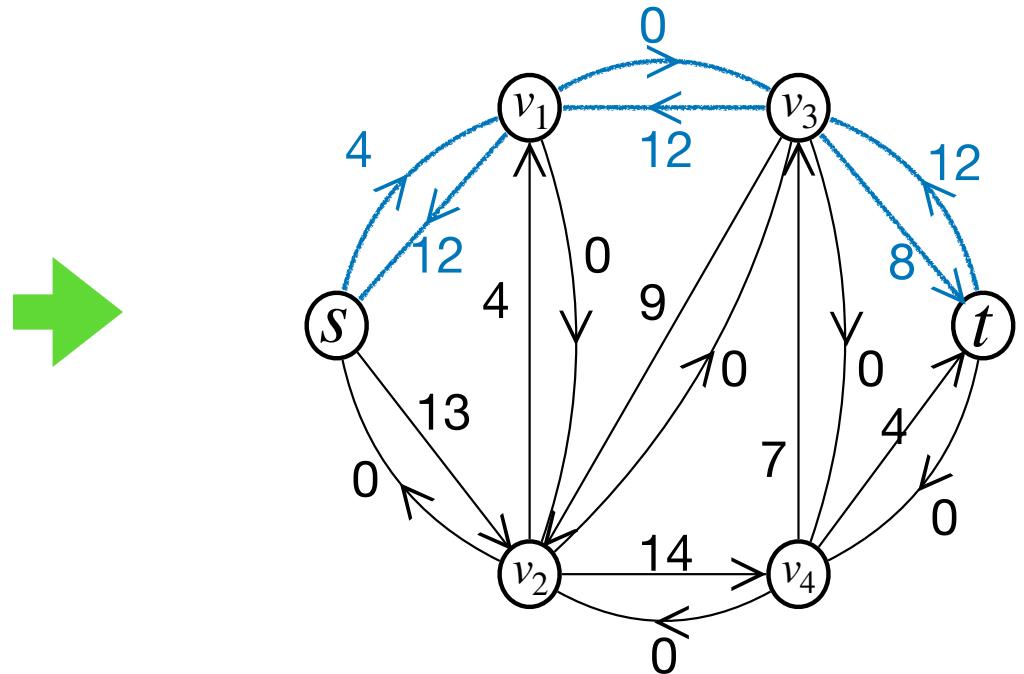


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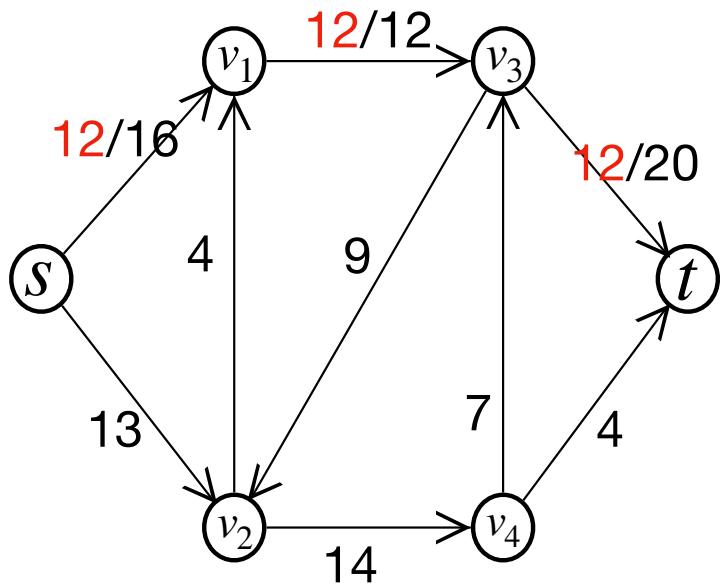


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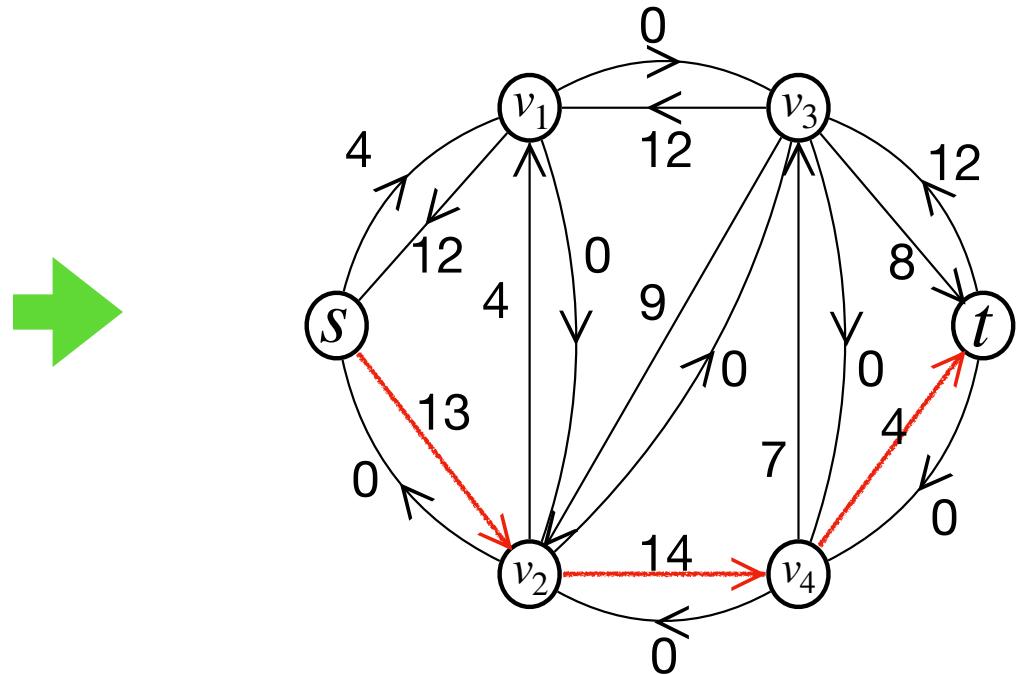


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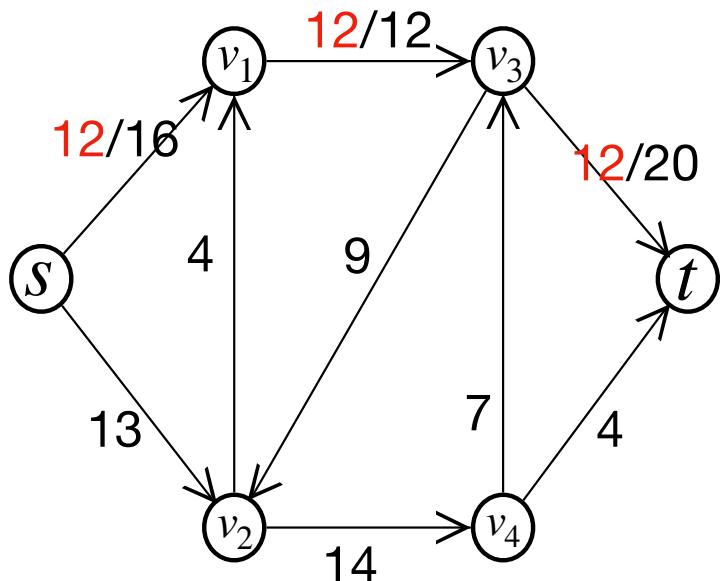


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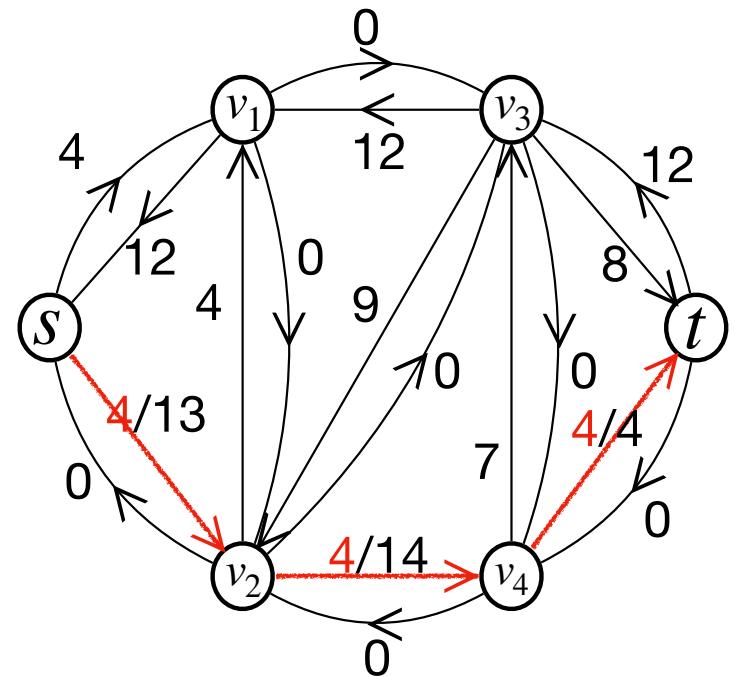


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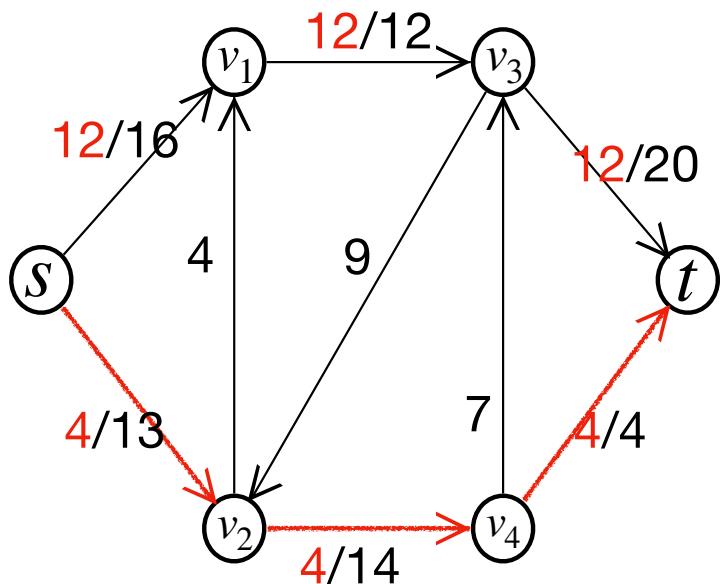


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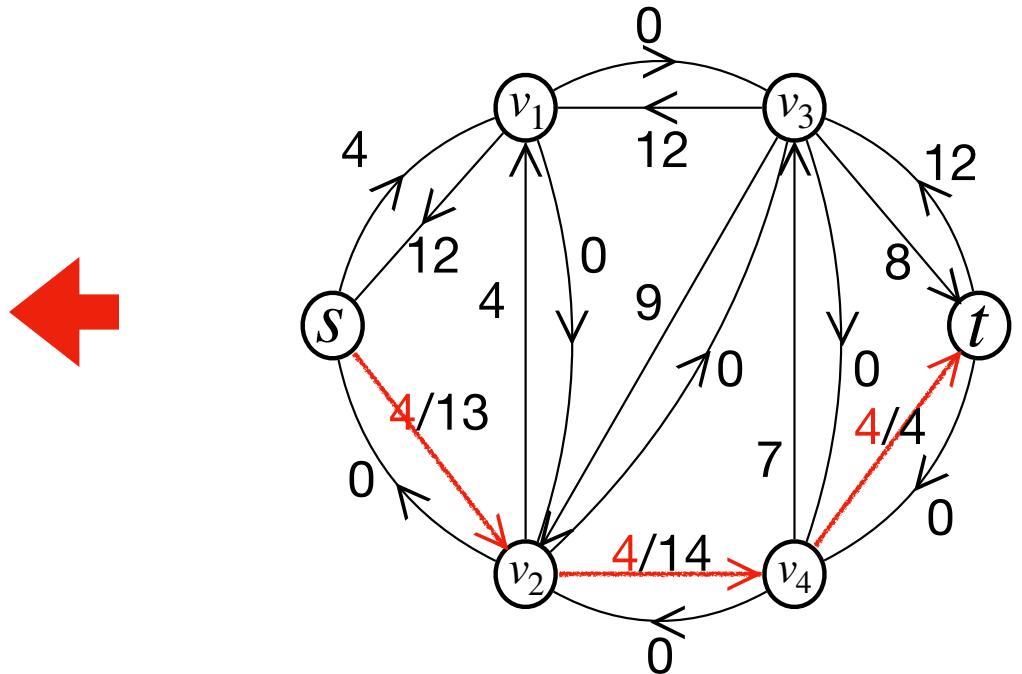


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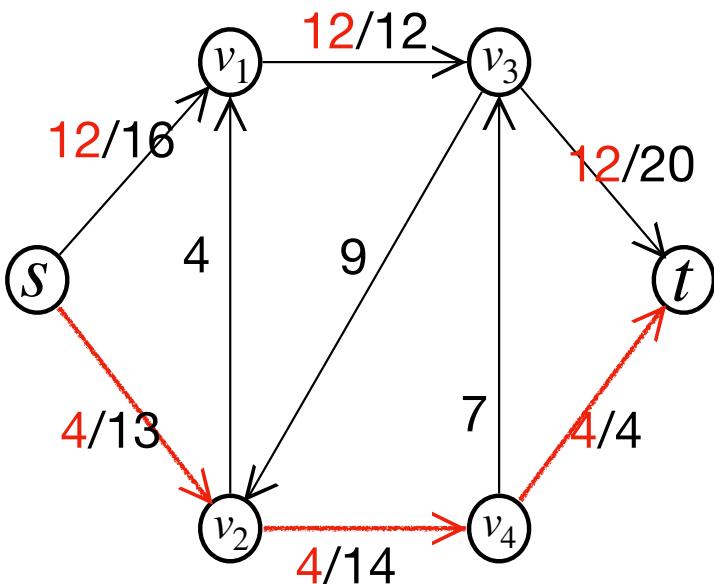


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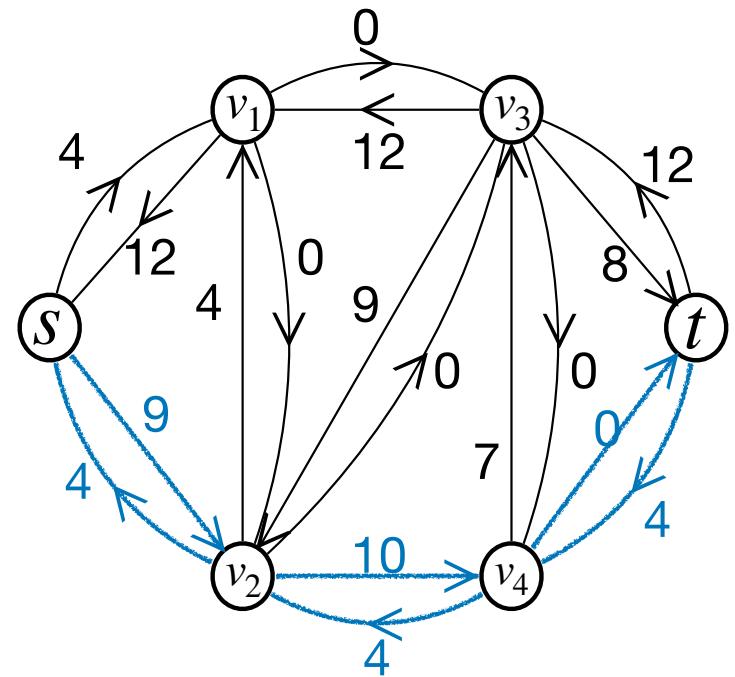


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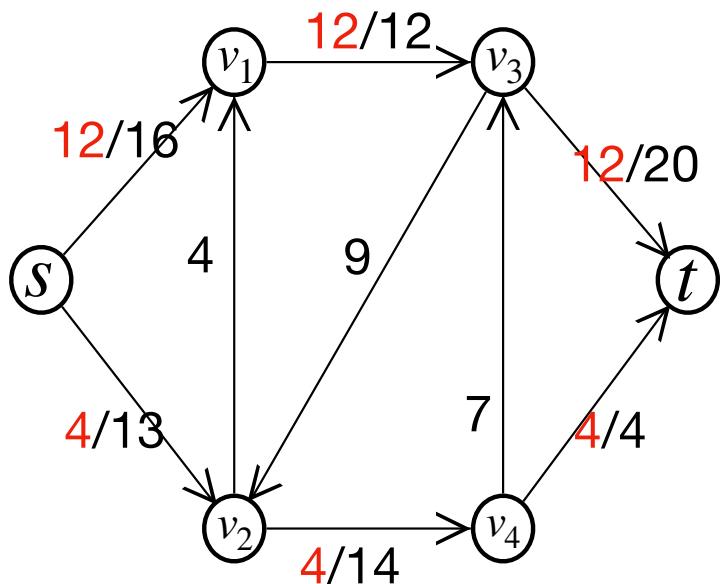


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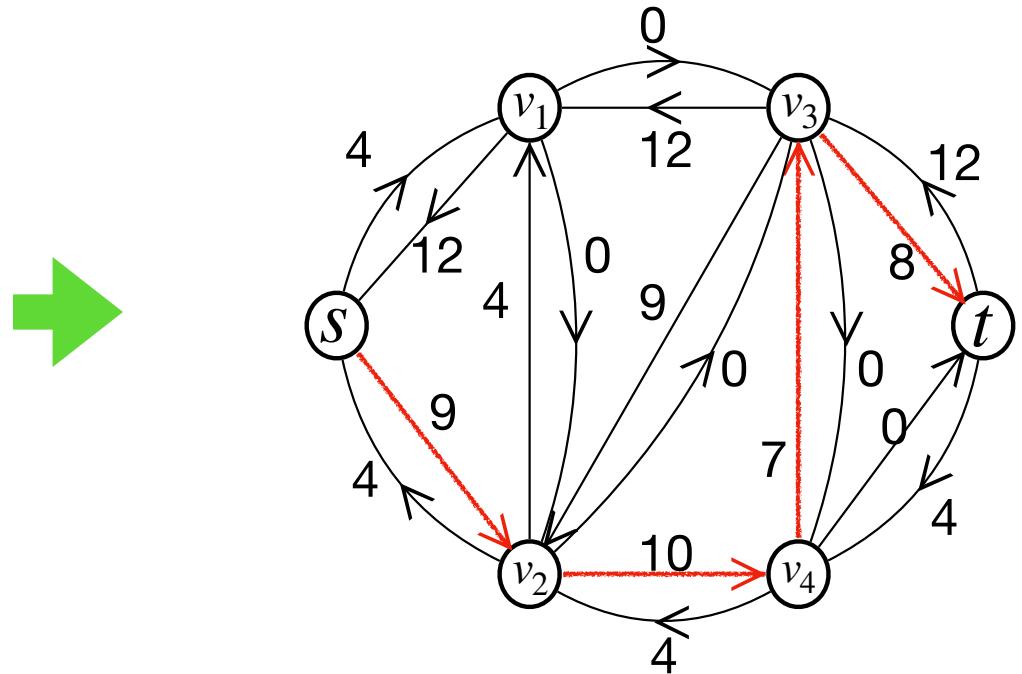


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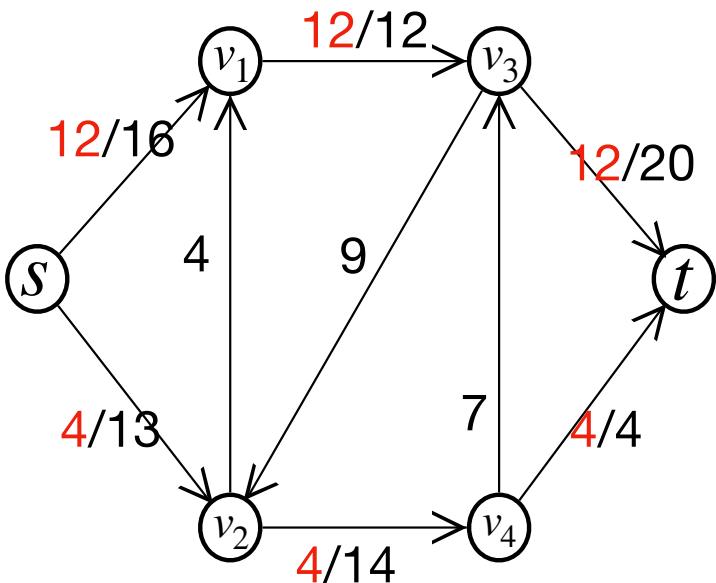


Residual network

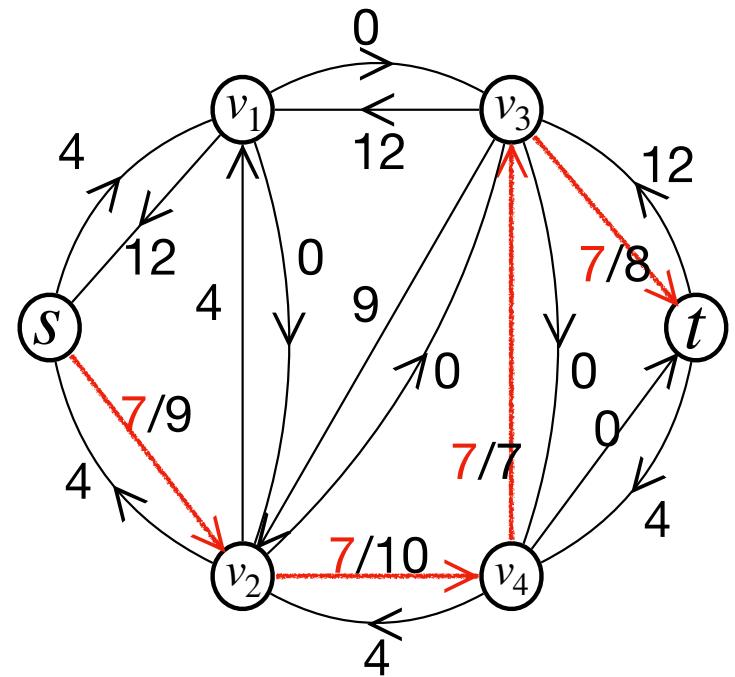


## Ford-Fulkerson Method

Original network

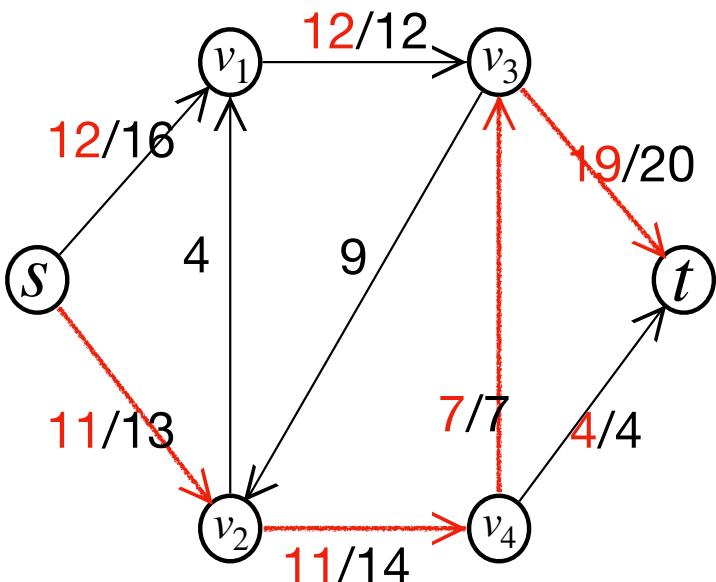


Residual network

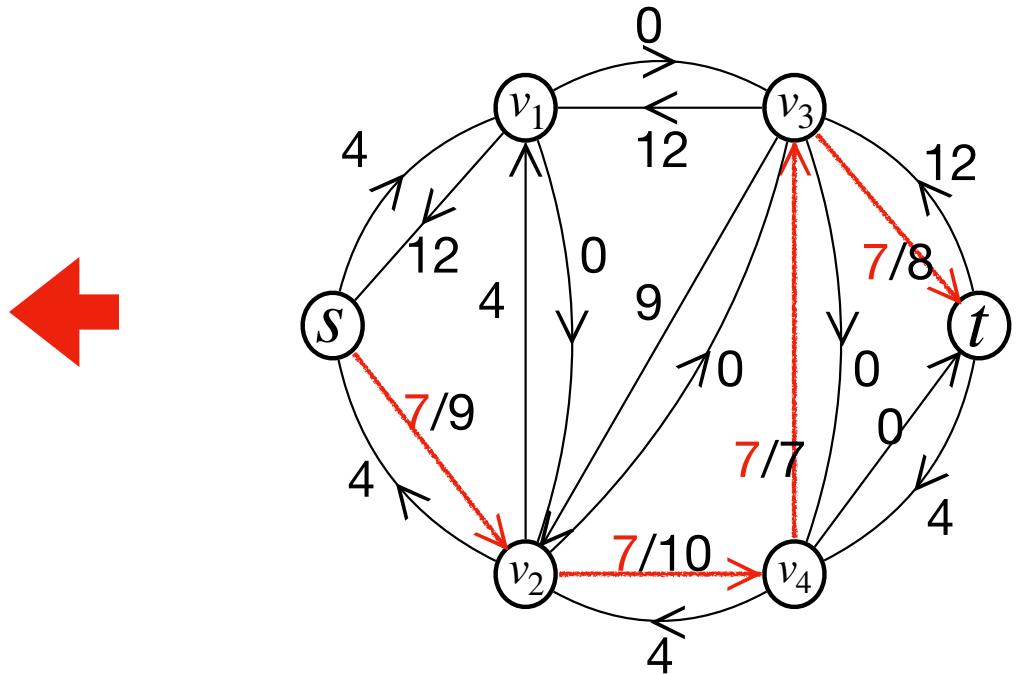


## Ford-Fulkerson Method

Original network

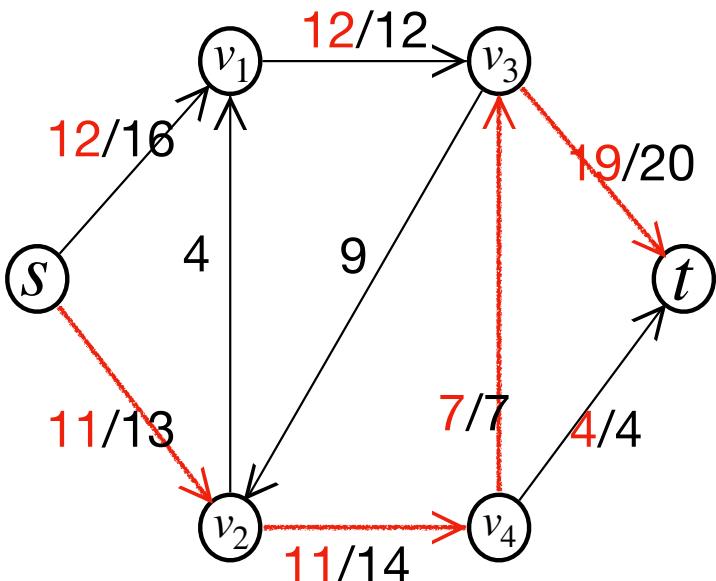


Residual network

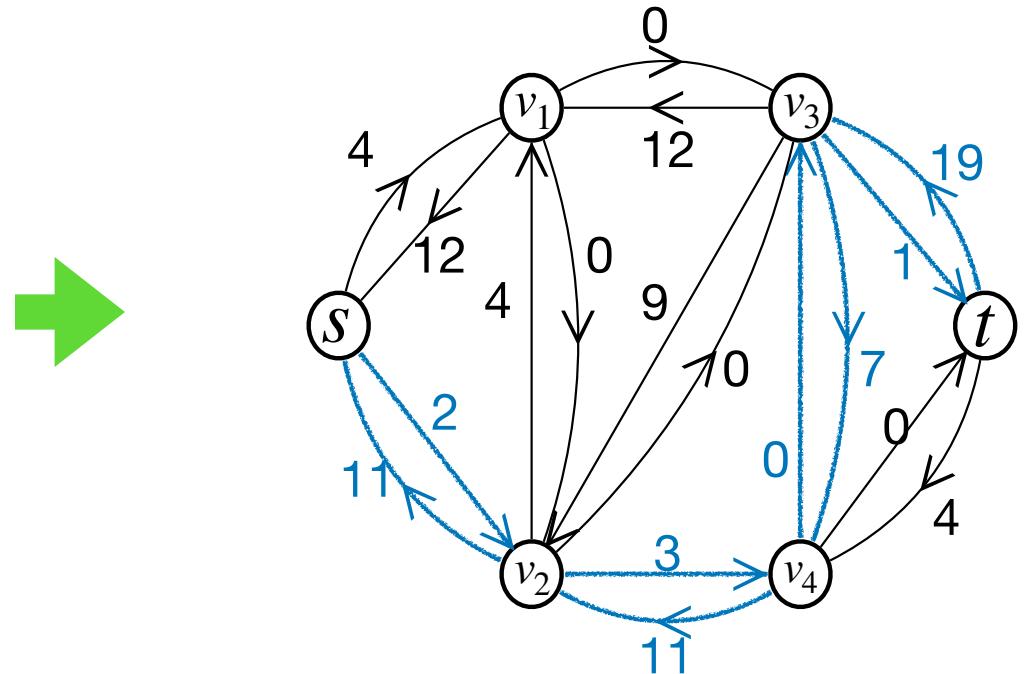


## Ford-Fulkerson Method

Original network

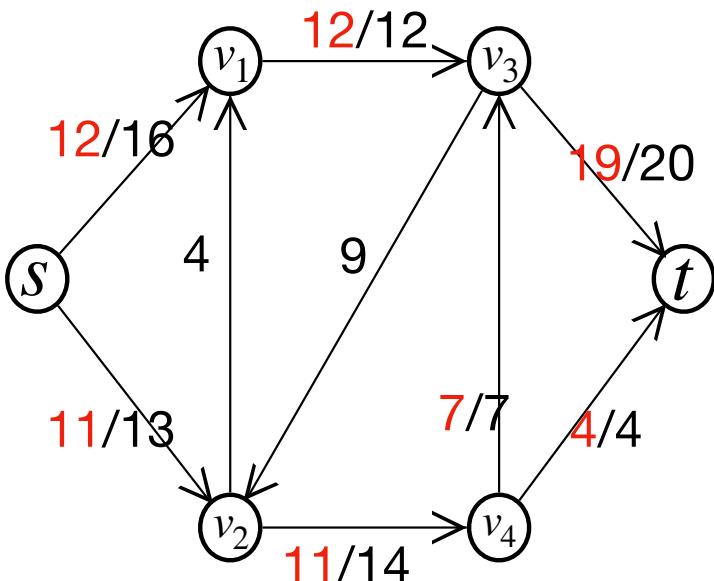


Residual network

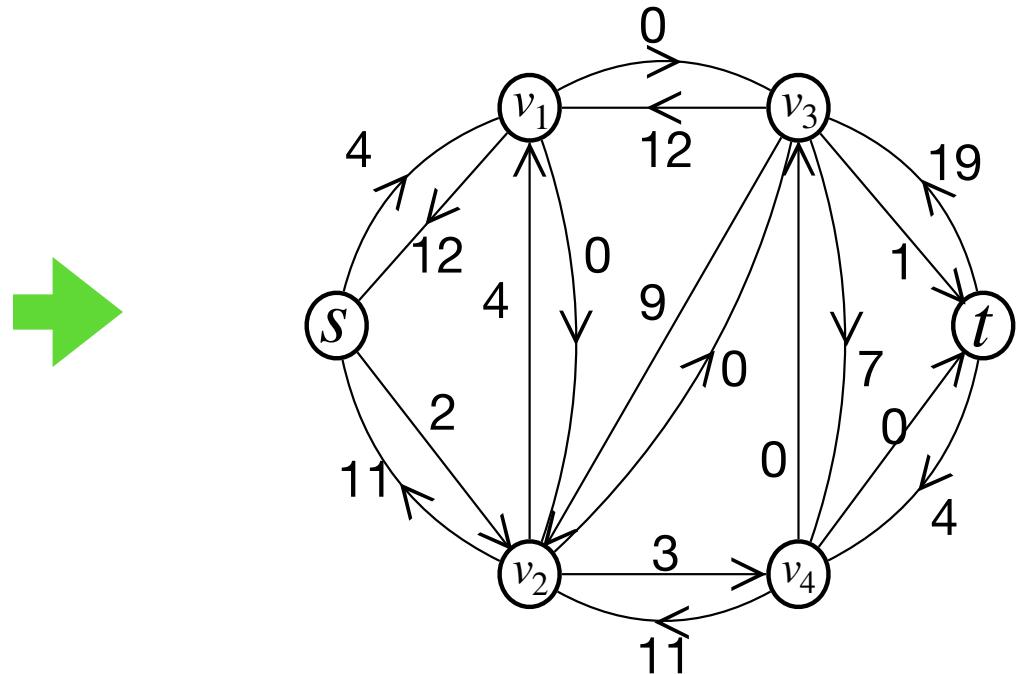


## Ford-Fulkerson Method

Original network



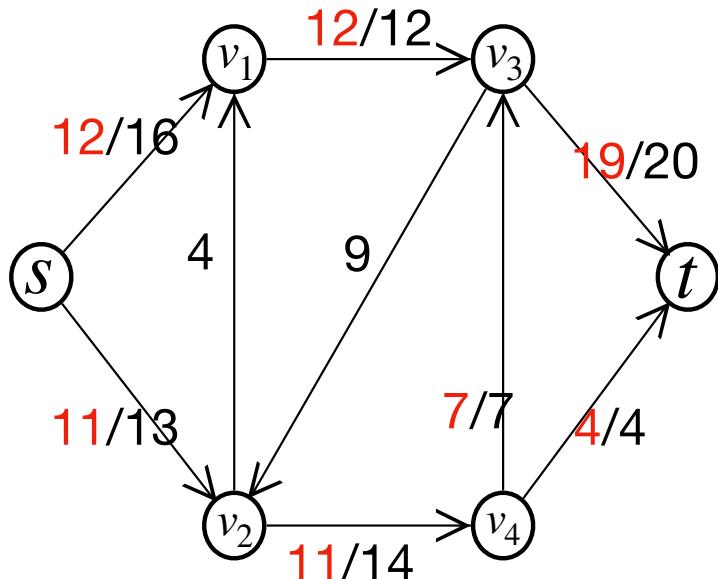
Residual network



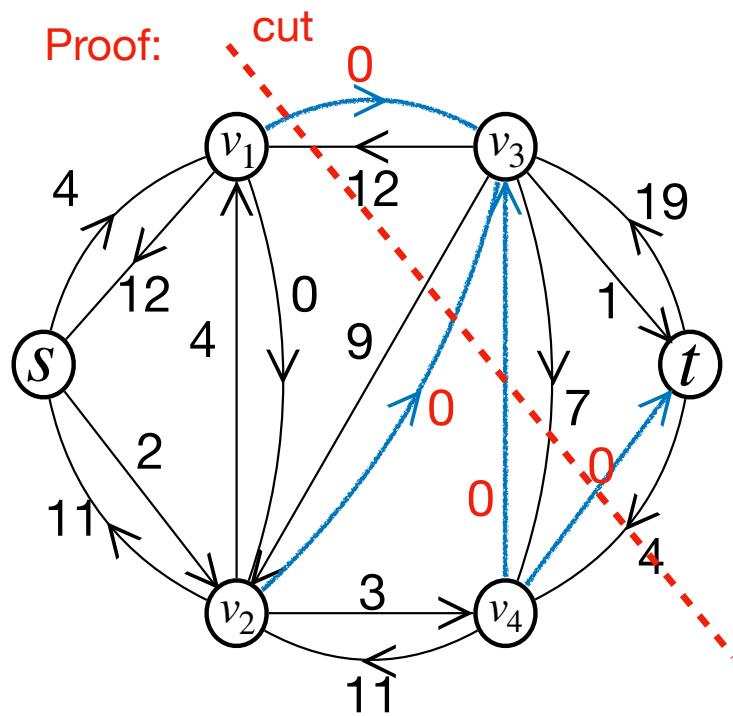
Is there still a path from  $s$  to  $t$  of residual capacity  $> 0$ ?

## Ford-Fulkerson Method

Original network



Residual network

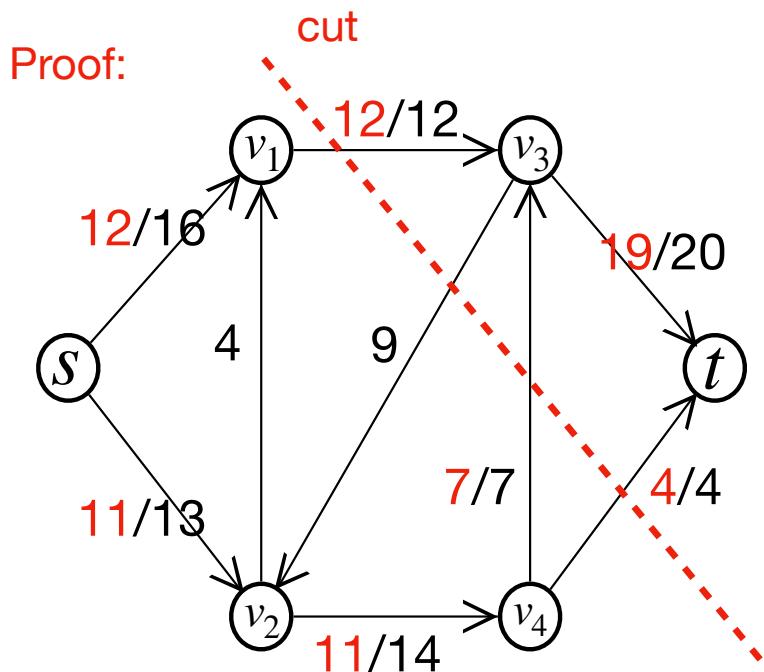


Is there still a path from  $s$  to  $t$  of residual capacity  $> 0$ ?

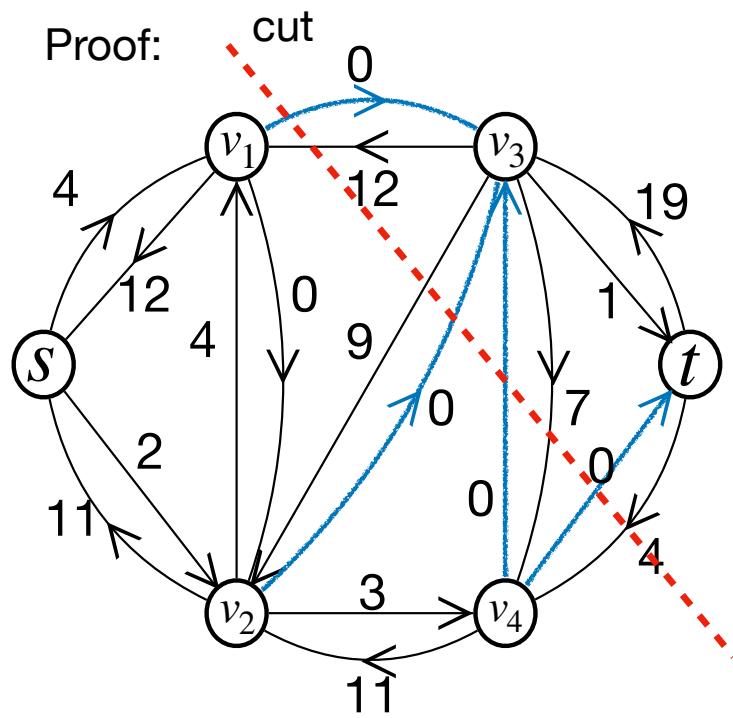
NO

## Ford-Fulkerson Method

Original network



Residual network



Size of flow:  $12+11=19+4=23$

Is it optimal? YES.

Is there still a path from  $s$  to  $t$  of residual capacity  $> 0$ ?

NO