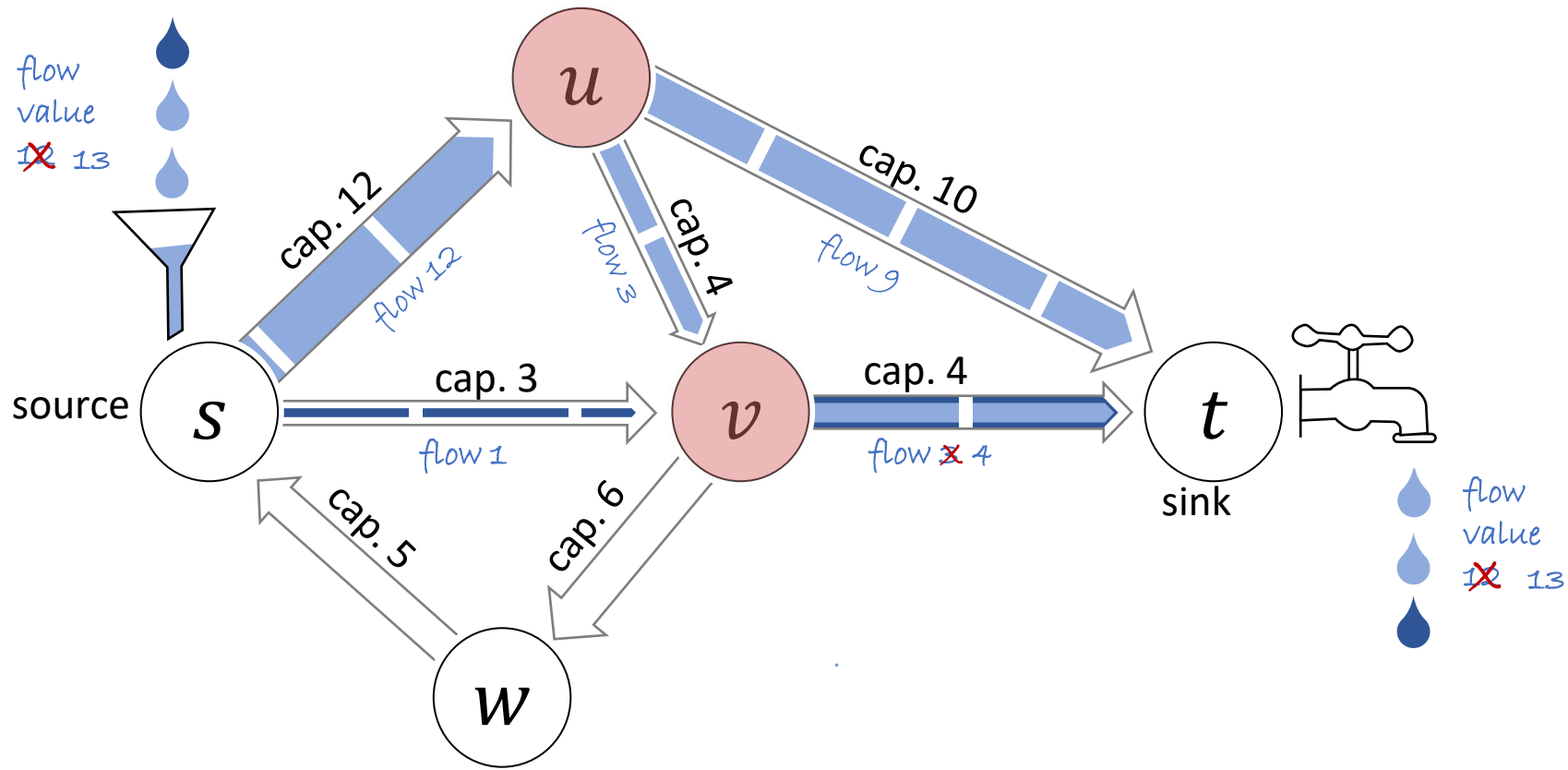




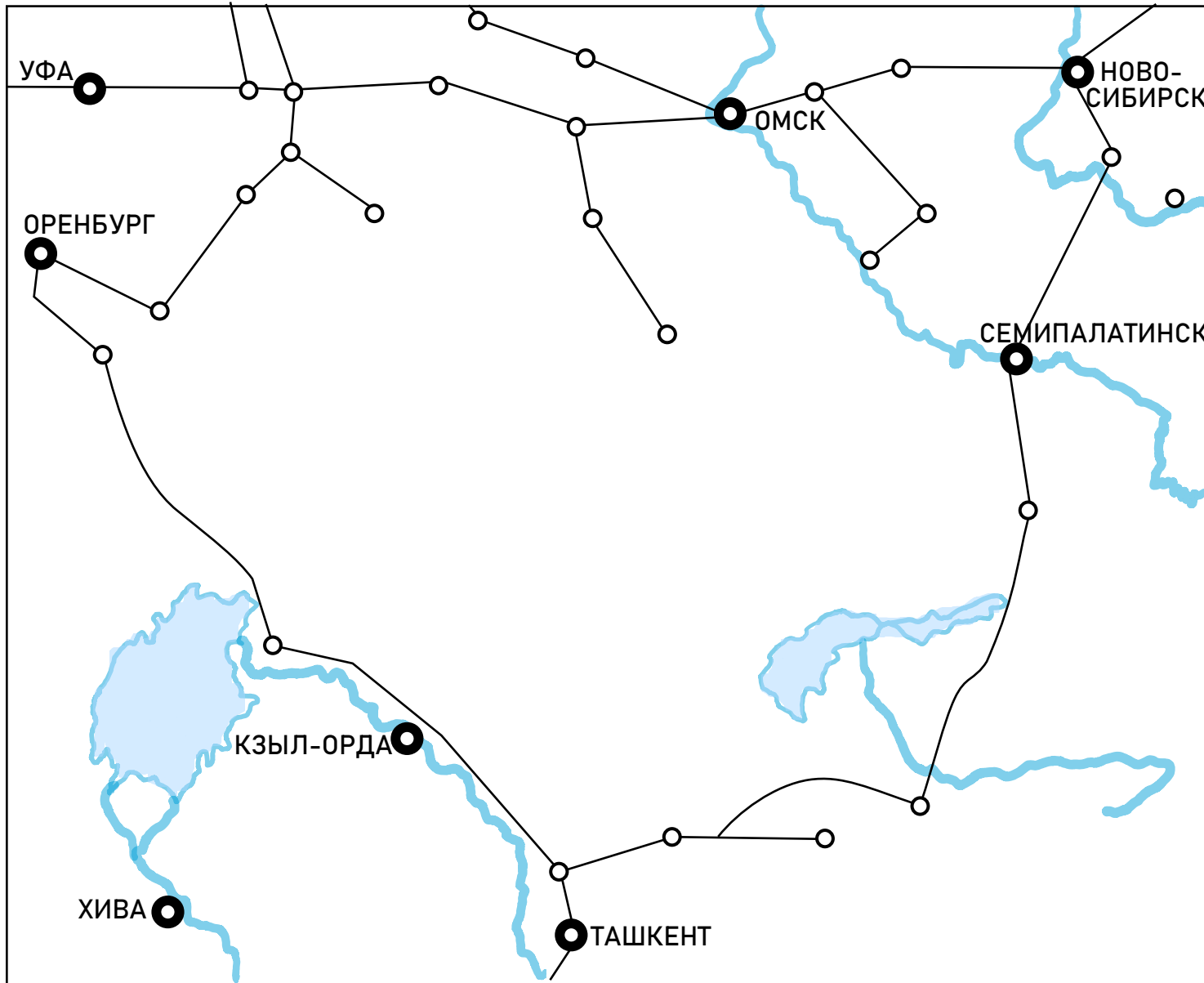
SECTION 6.1

# Flow networks

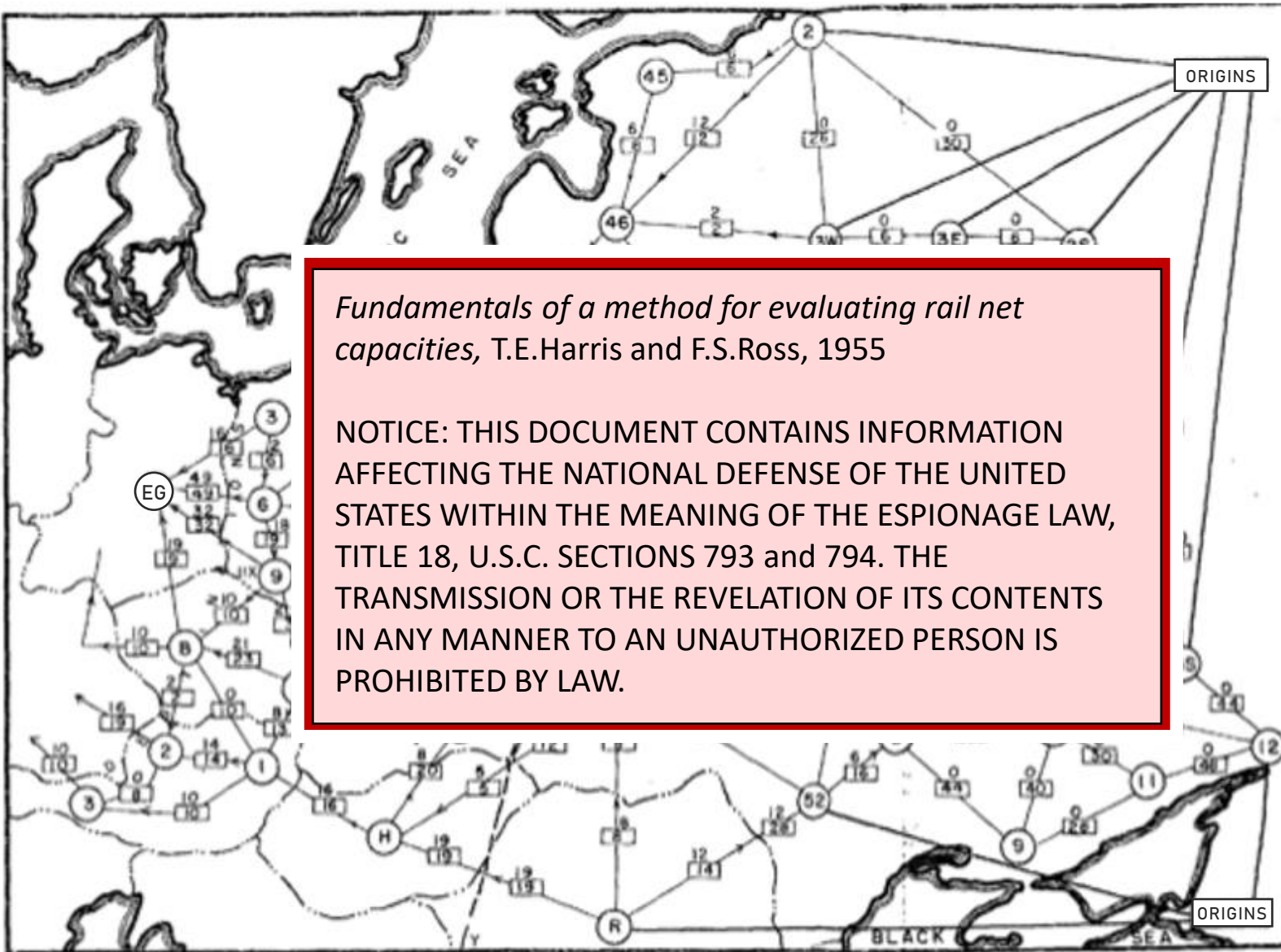


## THE FLOW PROBLEM

Consider a directed graph in which each edge has a capacity. How should we assign a flow to each edge, so as to maximize the flow value?



*Methods of finding the minimum total kilometrage in cargo-transportation planning in space, A.N.Tolstoy, 1930*



*Fundamentals of a method for evaluating rail net capacities*, T.E.Harris and F.S.Ross, 1955

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Fig. 7 — Traffic pattern: entire network available

- Legend:
- International boundary
  - ⊙ Railway operating division
  - ← [12] Capacity: 12 each way per day. Required flow of 9 per day toward destinations (in direction of arrow) with equivalent number of returning trains in opposite direction
- All capacities in  $\sqrt{1000}$ 's of tons each way per day
- Origins: Divisions 2, 3W, 3E, 25, 13N, 13S, 12, 52 (USSR), and Roumania
- Destinations: Divisions 3, 6, 9 (Poland); 8 (Czechoslovakia); and 2, 3 (Austria)
- Alternative destinations: Germany or East Germany
- Note 11K of Division 9, Poland



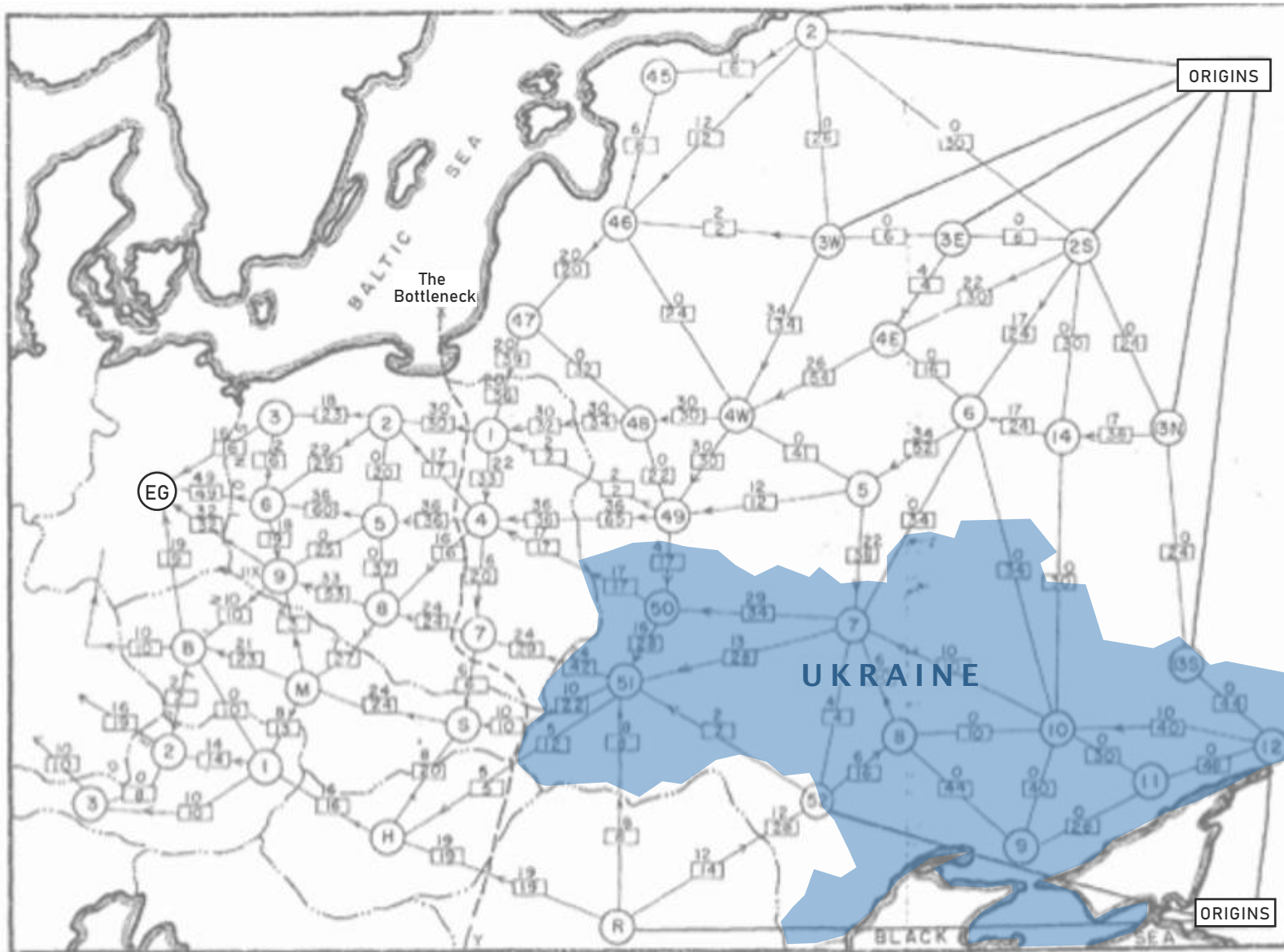


Fig. 7 — Traffic pattern: entire network available

Legend:

- International boundary
- ⊙ Railway operating division
- ← [12] → Capacity: 12 each way per day. Required flow of 9 per day toward destinations (in direction of arrow) with equivalent number of returning trains in opposite direction

All capacities in trains /1000's of tons each way per day

Origins: Divisions 2, 3W, 3E, 2S, 13N, 13S, 12, 52 (USSR), and Roumania

Destinations: Divisions 3, 6, 9 (Poland); B (Czechoslovakia); and 2, 3 (Austria)

Alternative destinations: Germany or East Germany

Note IIX of Division 9, Poland

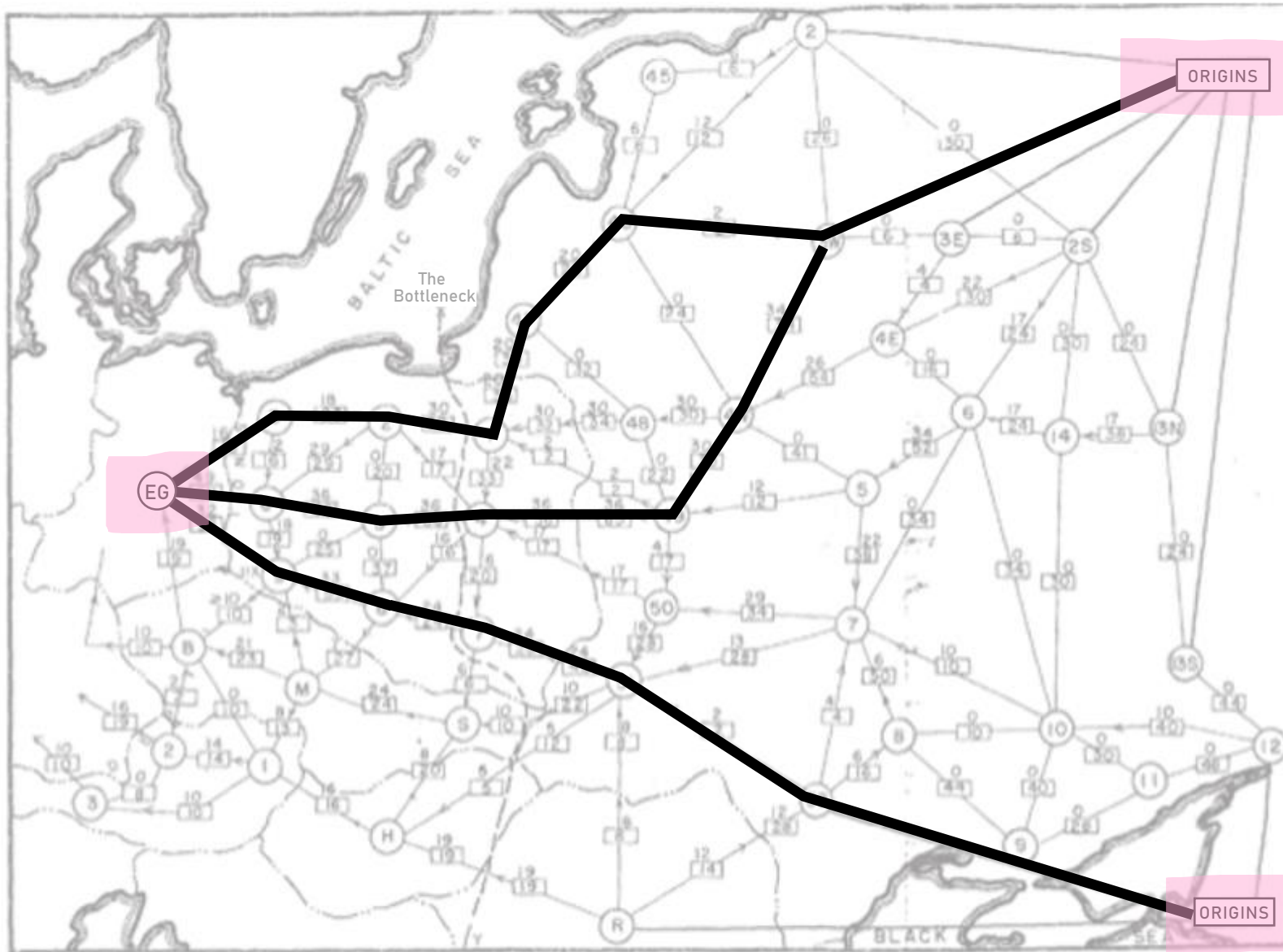


Fig. 7 — Traffic pattern: entire network available

Legend:

- International boundary
- ⊙ Railway operating division
- ← [12] → Capacity: 12 each way per day. Required flow of 9 per day toward destinations (in direction of arrow) with equivalent number of returning trains in opposite direction

All capacities in  $\sqrt{1000}$ 's of tons each way per day

Origins: Divisions 2, 3W, 3C, 2S, 13N, 13S, 12, 52 (USSR), and Rumania

Destinations: Divisions 3, 6, 9 (Poland); 8 (Czechoslovakia); and 2, 3 (Austria)

Alternative destinations: Germany or East Germany

Note IIX of Division 9, Poland

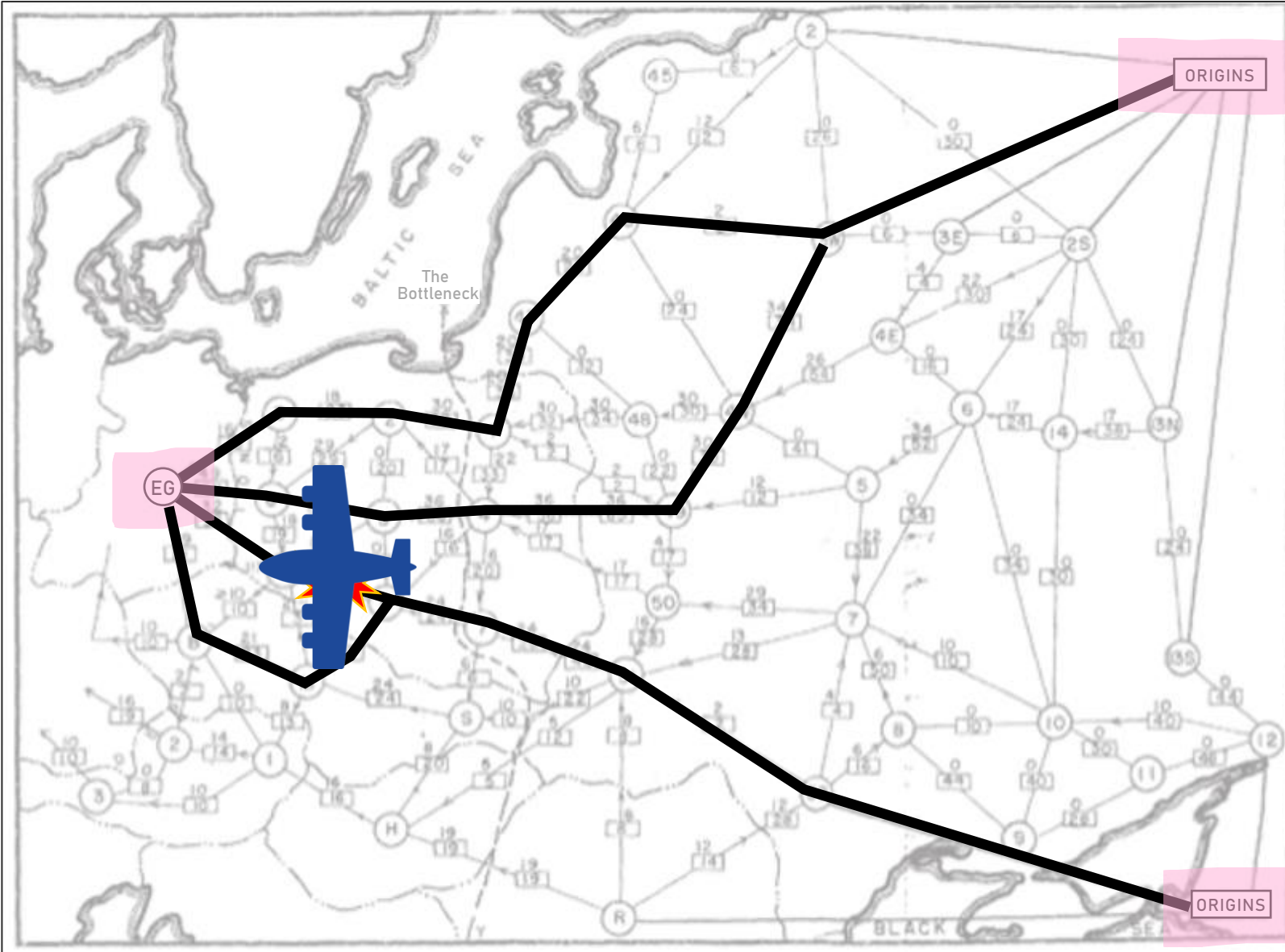
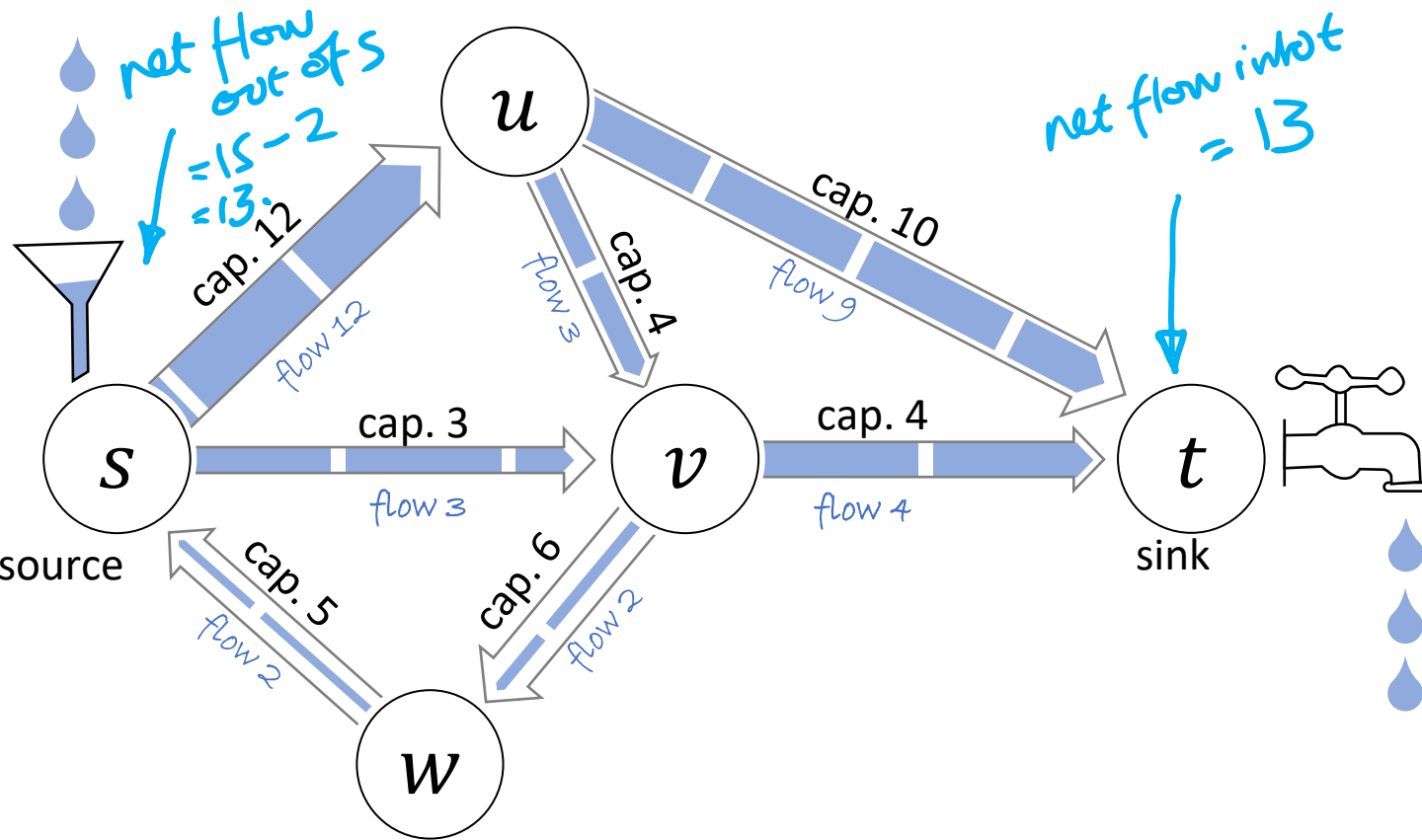


Fig. 7 — Traffic pattern: entire network available

Legend:  
--- International boundary  
⊙ Railway operating division  
← [12] → Capacity: 12 each way per day. Required flow of 9 per day toward destinations (in direction of arrow) with equivalent number of returning trains in opposite direction  
All capacities in  $\sqrt{1000}$ 's of tons each way per day  
Origins: Divisions 2, 3W, 3C, 2S, 13N, 13S, 12, 52 (USSR), and Roumania  
Destinations: Divisions 3, 6, 9 (Poland); 8 (Czechoslovakia); and 2, 3 (Austria)  
Alternative destinations: Germany or East Germany  
Note: IIX of Division 9, Poland





Given a directed graph with a **source vertex**  $s$  and a **sink vertex**  $t$ , where each edge  $u \rightarrow v$  has a **capacity**  $c(u \rightarrow v) > 0$ ,

a **flow**  $f$  is a set of edge labels  $f(u \rightarrow v)$  such that

- $0 \leq f(u \rightarrow v) \leq c(u \rightarrow v)$  on every edge
- total flow in = total flow out, at all vertices other than  $s$  and  $t$

and the **value of the flow** is

- $\text{value}(f) = \text{net flow out of } s = \text{net flow into } t$

**FLOW CONSERVATION**

e.g. at vertex  $v$ ,  
 flow in =  $3 + 3$   
 flow out =  $4 + 2$

## PROBLEM STATEMENT

Find a flow with maximum possible value (called a *maximum flow*).

In symbolic notation,

FLOW CONSERVATION says that at all vertices other than  $s$  and  $t$ , total flow in = total flow out:

$$\forall v \in V \setminus \{s, t\} : \sum_{w: v \rightarrow w} f(v \rightarrow w) = \sum_{w: w \rightarrow v} f(w \rightarrow v)$$

Equivalently,

$$\forall v \in V \setminus \{s, t\} : \sum_{w: v \rightarrow w} f(v \rightarrow w) - \sum_{w: w \rightarrow v} f(w \rightarrow v) = 0 \quad \text{i.e. net flow in is zero.}$$

### FLOW VALUE

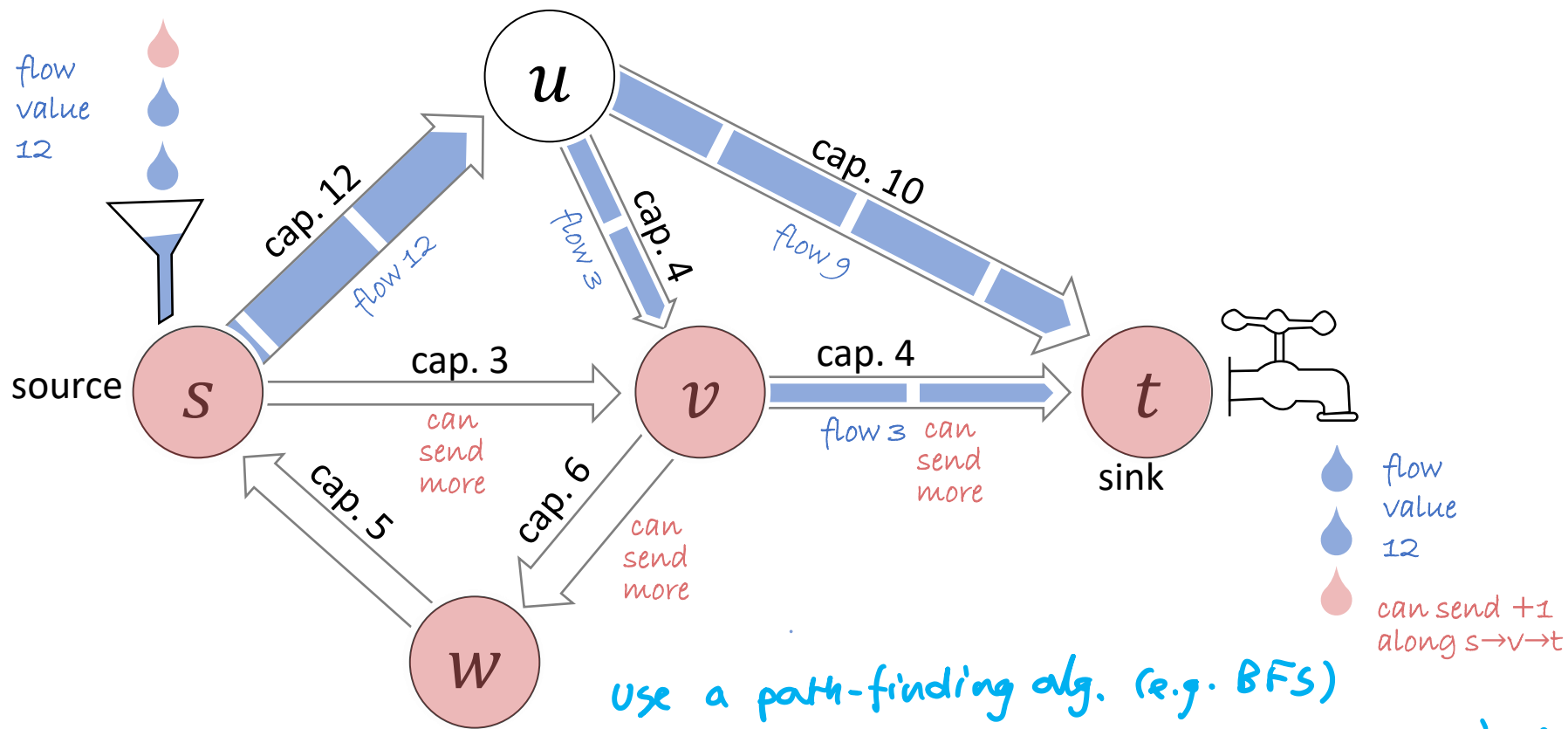
$$= \text{net flow out of } s = \sum_{v: s \rightarrow v} f(s \rightarrow v) - \sum_{v: v \rightarrow s} f(v \rightarrow s)$$

$$= \text{net flow into } t = \sum_{v: v \rightarrow t} f(v \rightarrow t) - \sum_{v: t \rightarrow v} f(t \rightarrow v)$$

(The example sheet asks you to prove that these two are always equal. It uses a proof technique from next lecture.)

SECTION 6.2

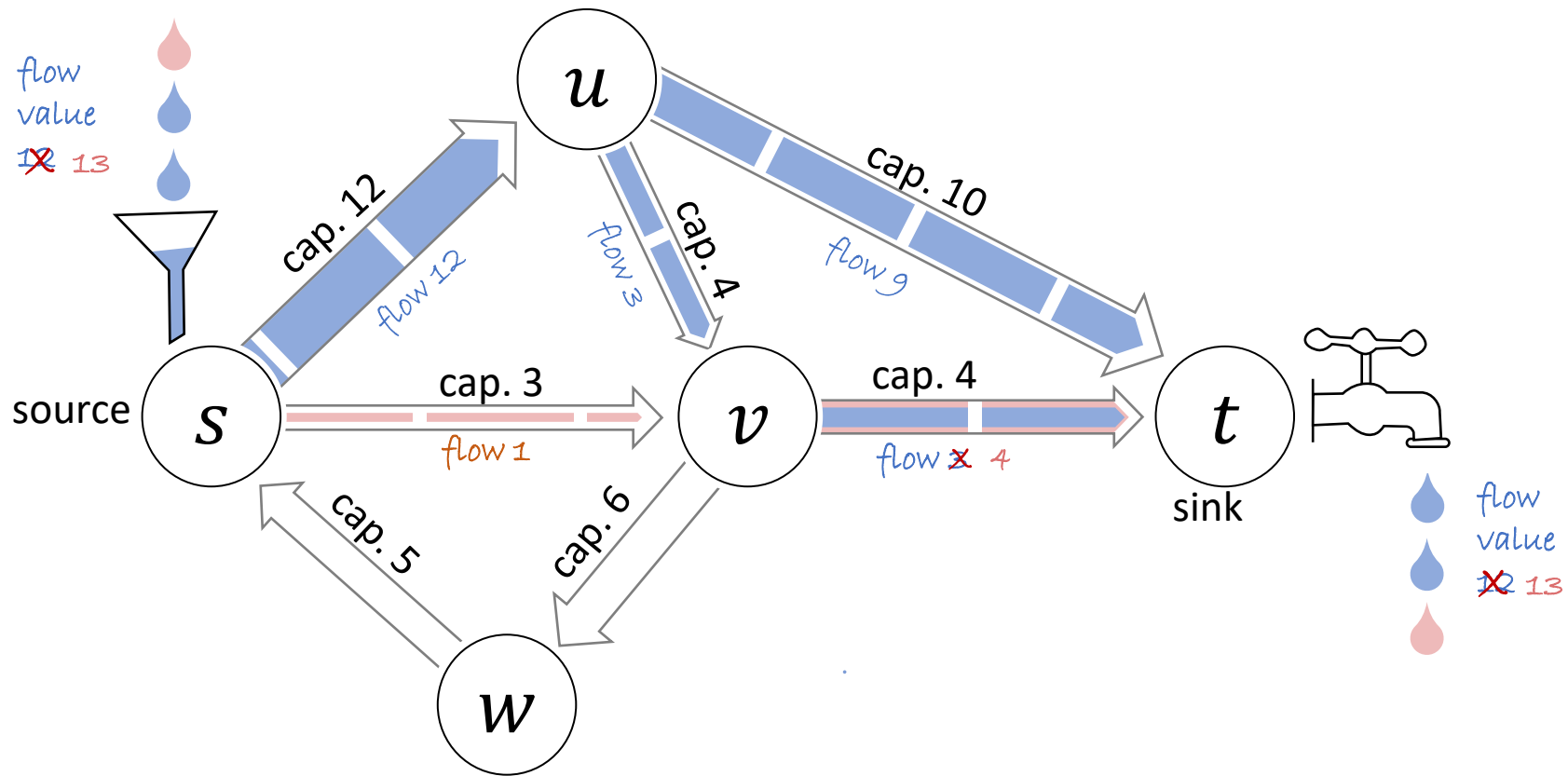
# Ford-Fulkerson algorithm



Use a path-finding alg. (e.g. BFS)  
 on the graph of "edges where we can increase capacity":  
 Look for a path from  $S$  to  $t$ .

### SIMPLE GREEDY STRATEGY

Look for a path to the sink along which we can increase flow, then increase it as much as we can. Repeat this, until we can't reach the sink.

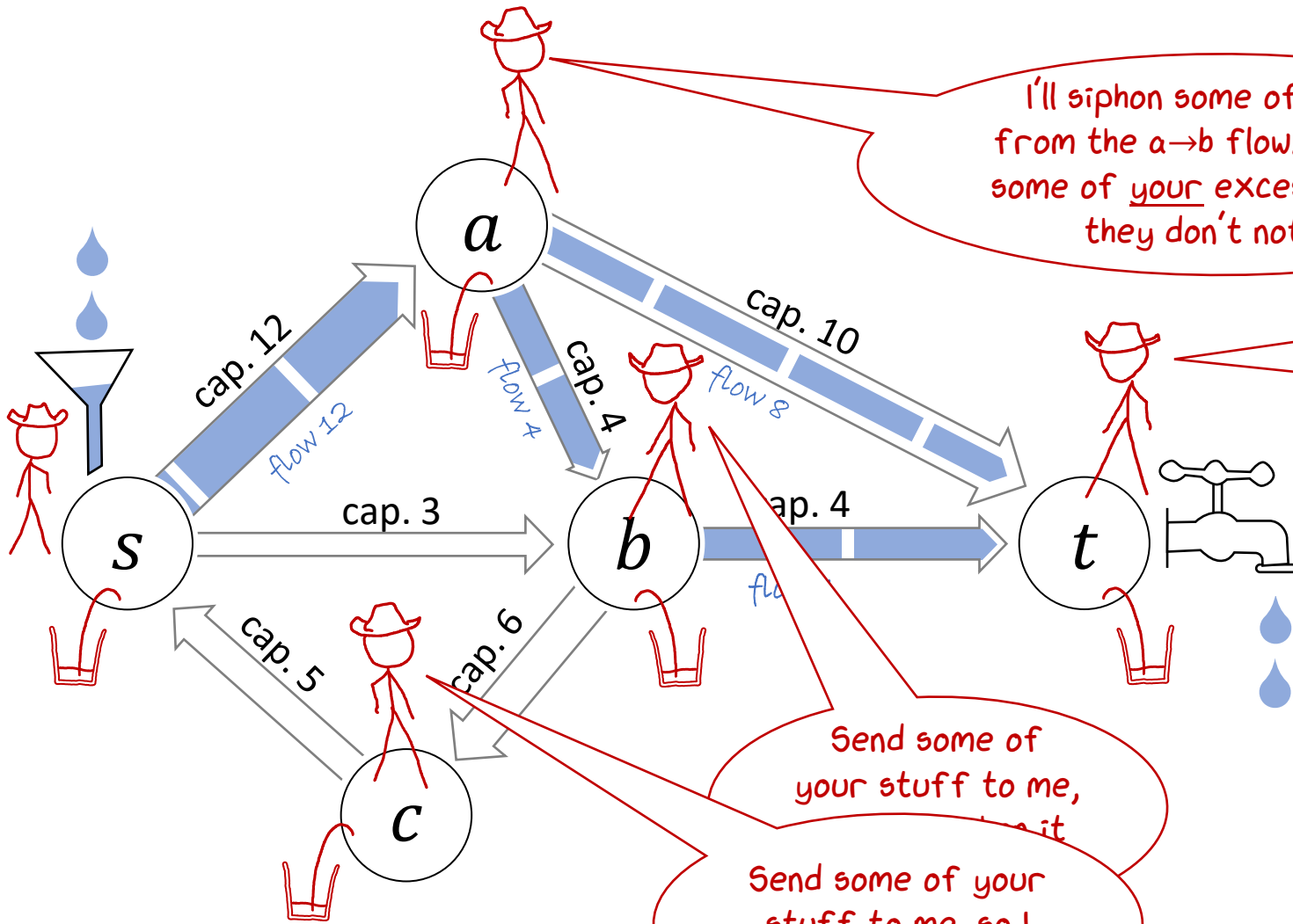


### SIMPLE GREEDY STRATEGY

Look for a path to the sink along which we can increase flow, then increase it as much as we can. Repeat this, until we can't reach the sink.

QUESTION. Can you find a larger-value flow than this?





I'll siphon some off here, from the  $a \rightarrow b$  flow. Redirect some of your excess to  $t$ , so they don't notice!

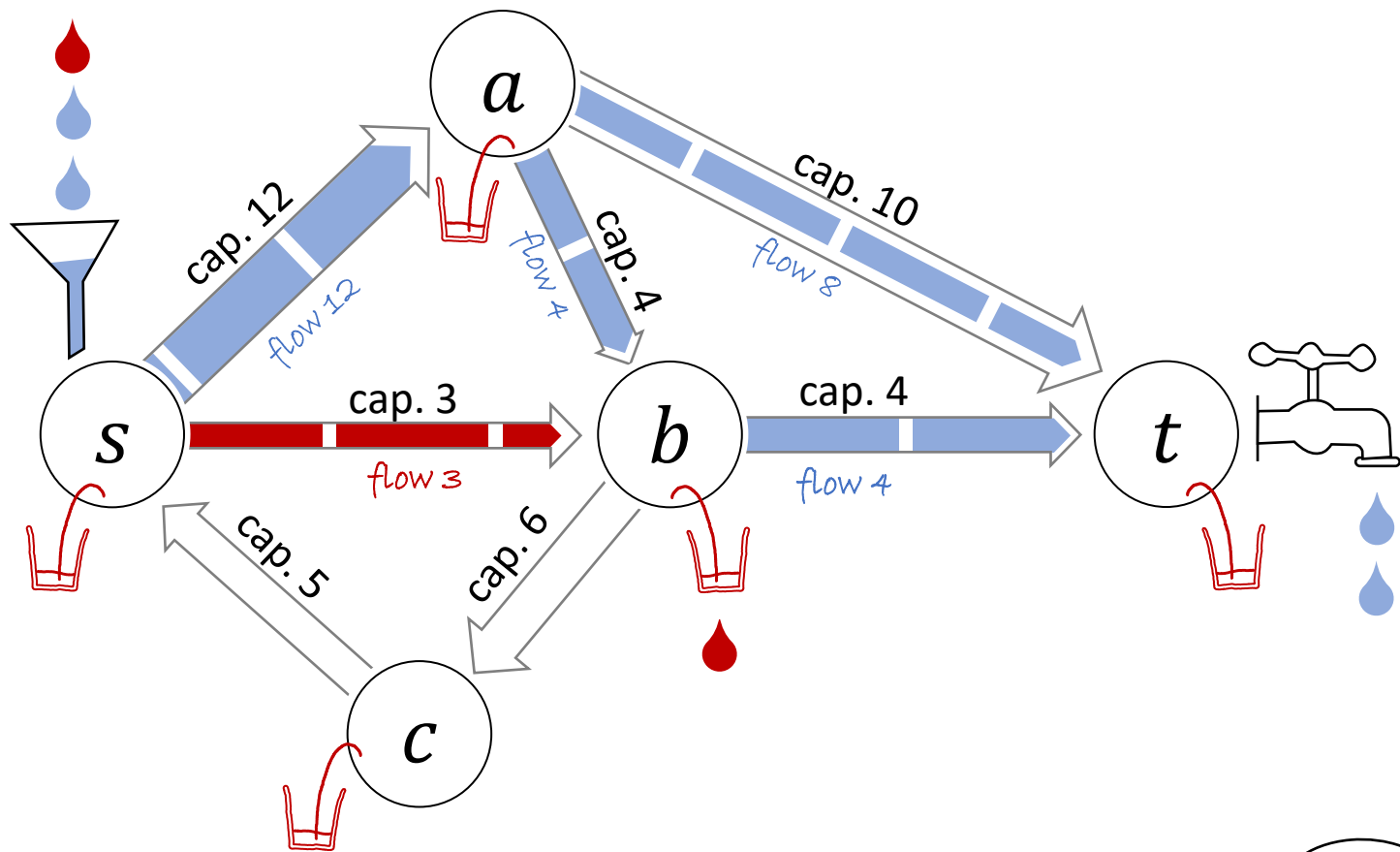
Send some of your stuff to me, so I can siphon it off!

Send some of your stuff to me, so I can siphon it off!

Send some of your stuff to me, so I can siphon it off!

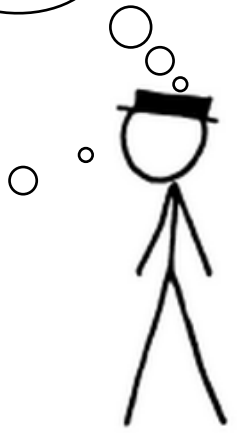
They've shown me I can increase my flow value!

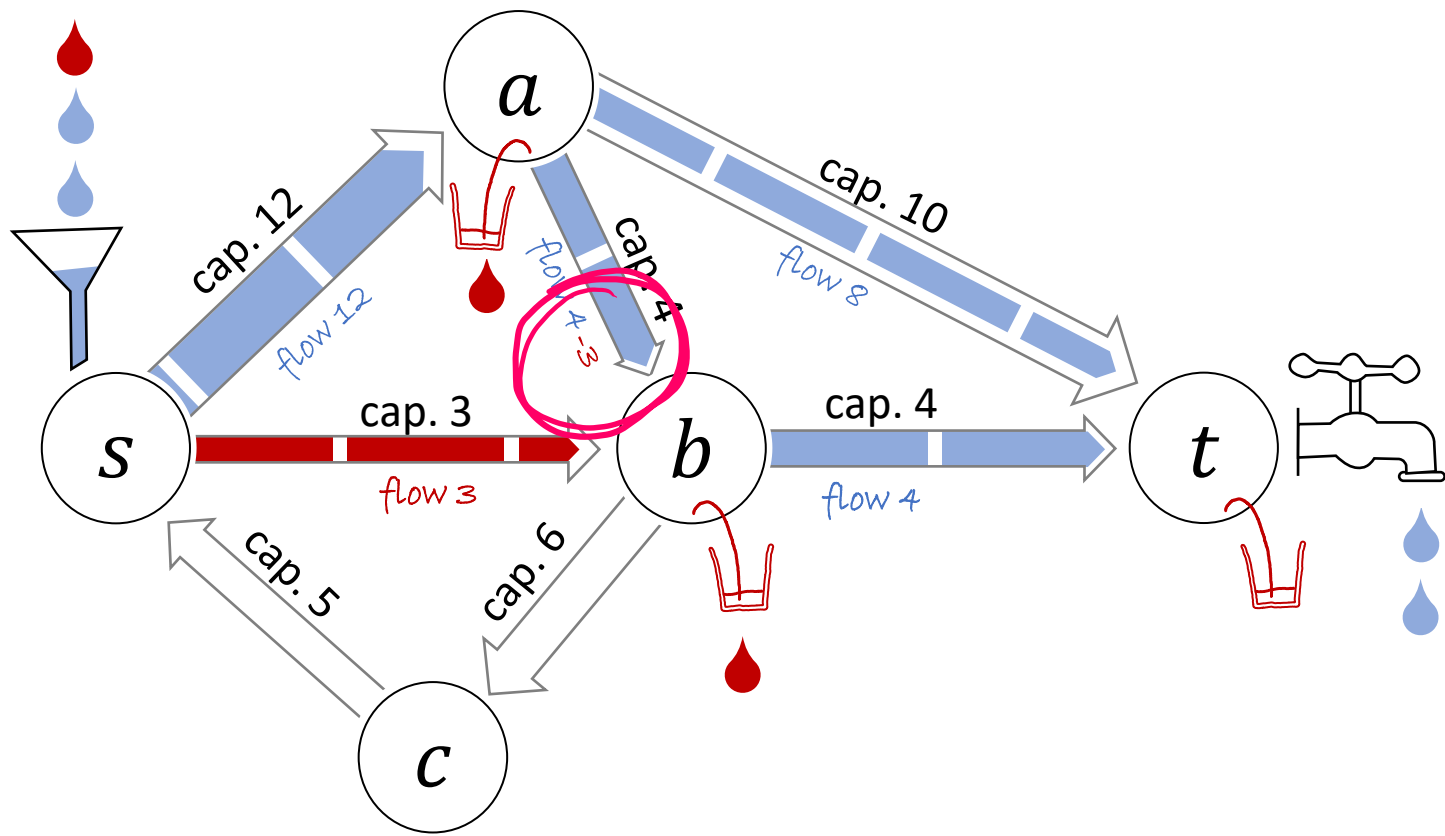




They've shown me I can increase my flow value!

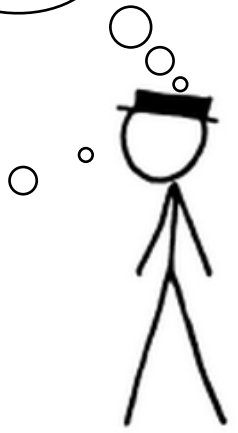
I could extract a flow of 3 at  $b$  ...

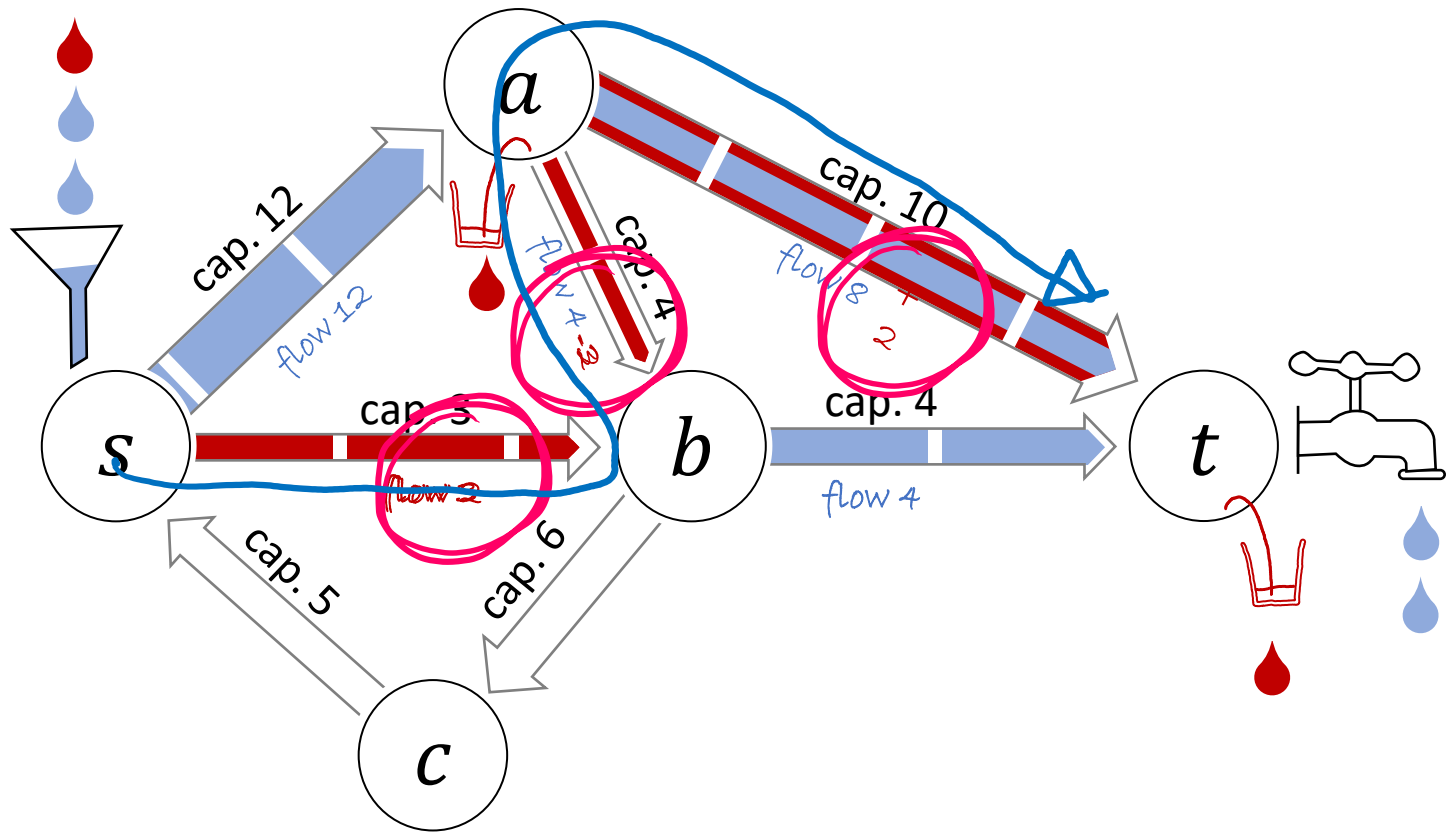




They've shown me I can increase my flow value!

Or I could extract a flow of 3 at a ...

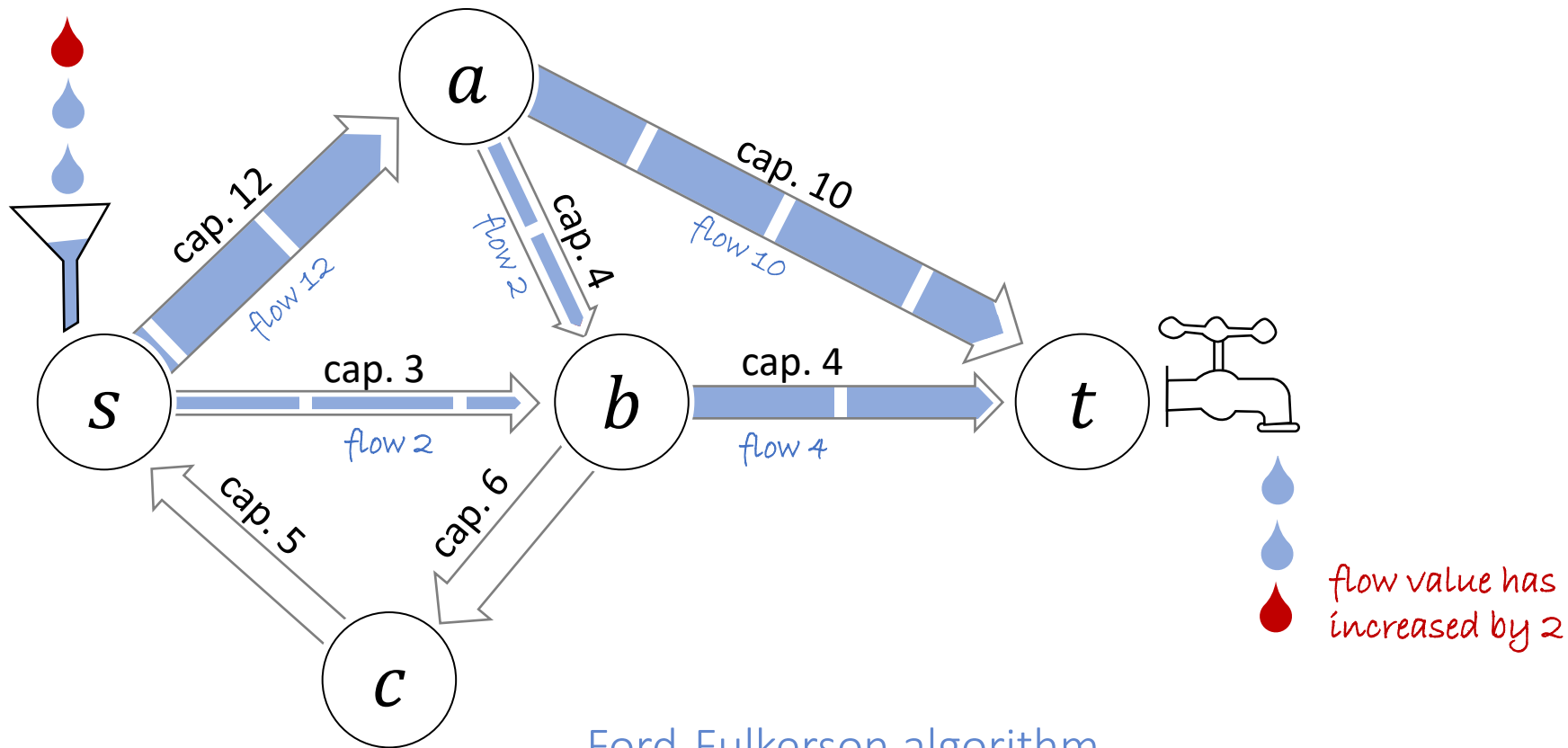




They've shown me I can increase my flow value!

I shall extract an extra flow of 2 at  $t$ .





## Ford-Fulkerson algorithm

1. Start with zero flow

**while** True:

2. Run bandit search to discover if the flow to  $t$  can be increased, and, if so, find an appropriate sequence of edges

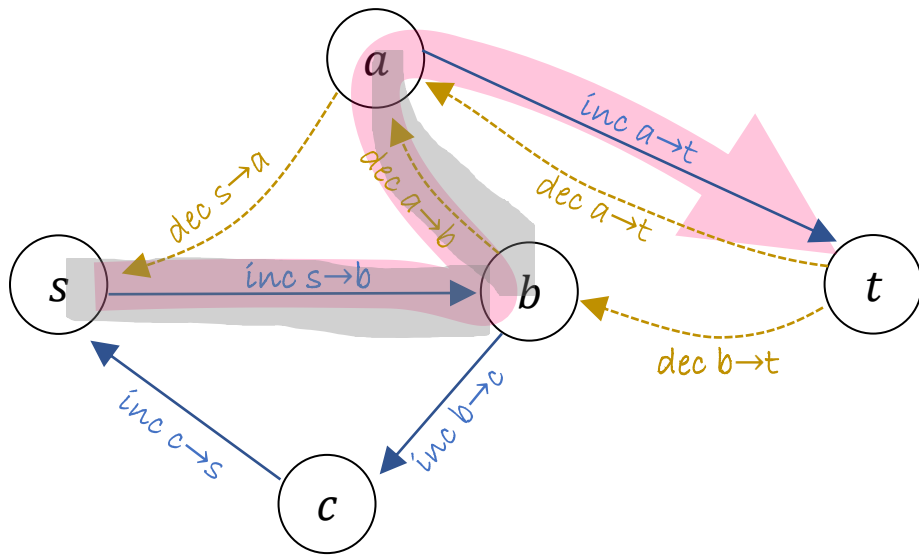
**if**  $t$  can be reached:

3. update the flow along those edges

**if**  $t$  can't be reached:

**break**





**STEP 2A.** Build the **residual graph**, which has the same vertices as the flow network, and

- if  $f(u \rightarrow v) < c(u \rightarrow v)$ :  
give the residual graph an edge  $u \rightarrow v$  with the label "increase flow  $u \rightarrow v$ "
- if  $f(u \rightarrow v) > 0$ :  
give the residual graph an edge  $v \rightarrow u$  with the label "decrease flow  $u \rightarrow v$ "

Not a typo!  

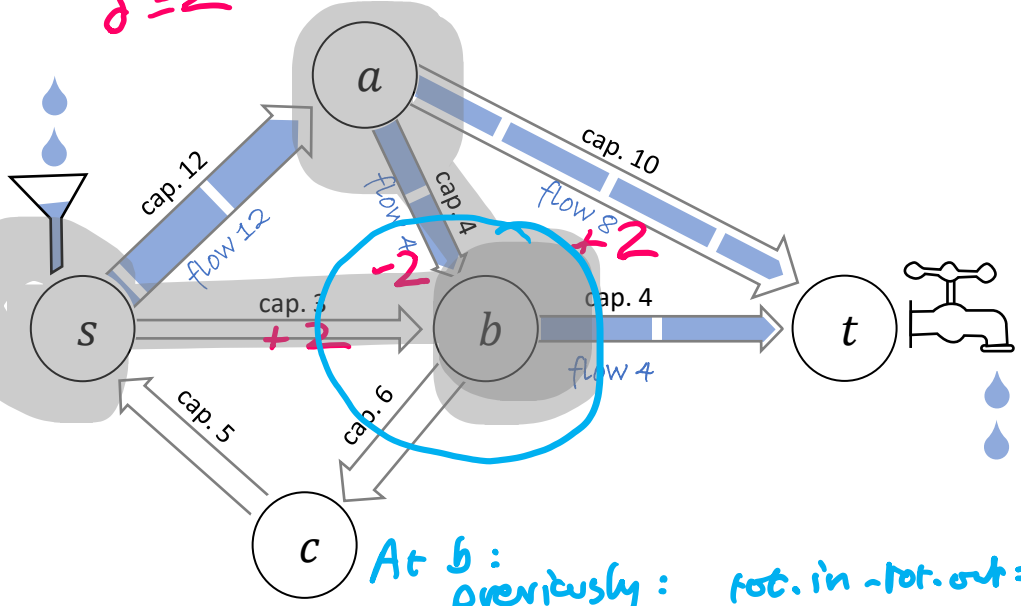
 The resid. edge is in the opposite direction to the edge in the flow network.

**STEP 2B.** Look for a path from  $s$  to  $t$  in the residual graph. This is called an **augmenting path**.

**STEP 3.** Find an update amount  $\delta > 0$  that can be applied to all the edges along the augmenting path. Apply it.

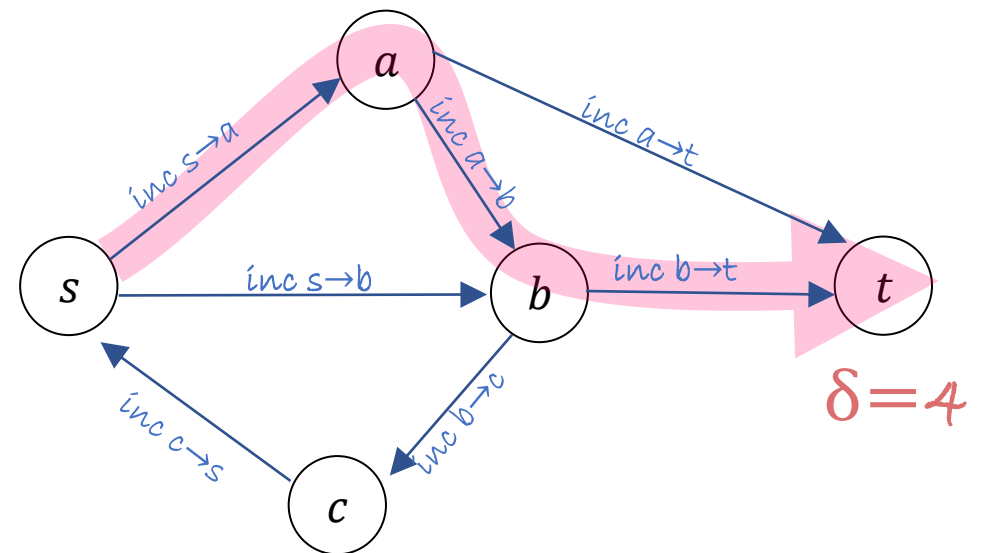
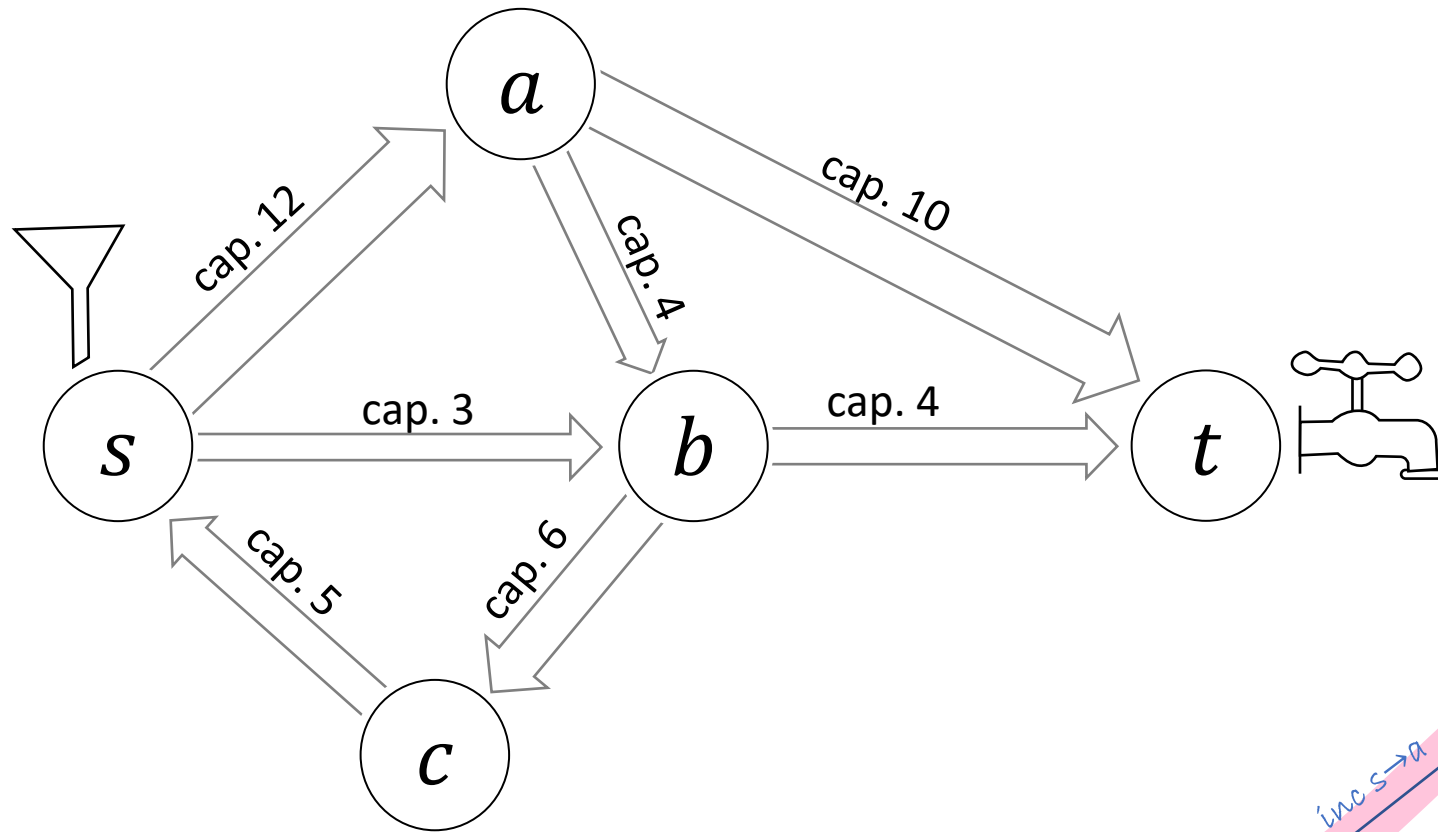
lemma This yields a valid flow.  
Proof • We chose  $\delta$  to ensure  $0 \leq f \leq c$ .  
 • flow conservation is still satisfied.

$\delta = 2$

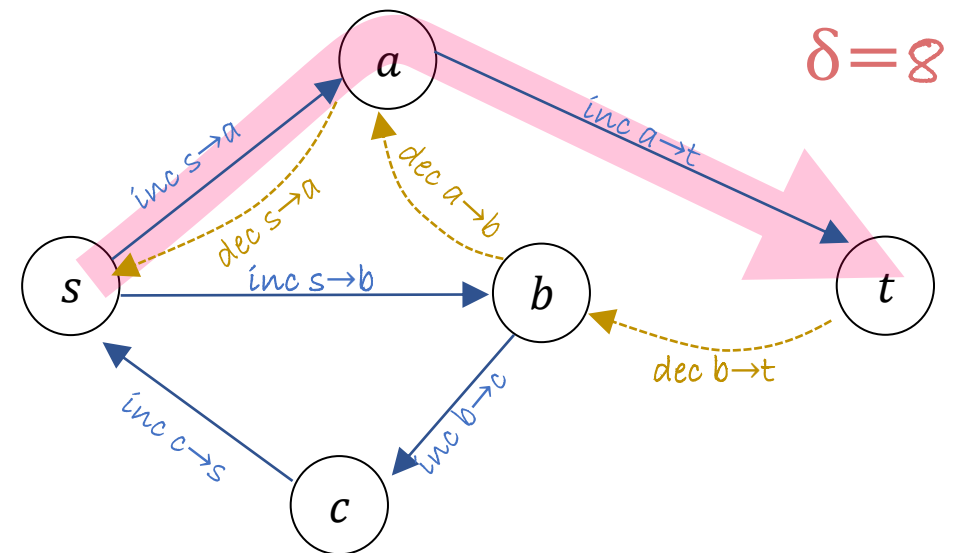
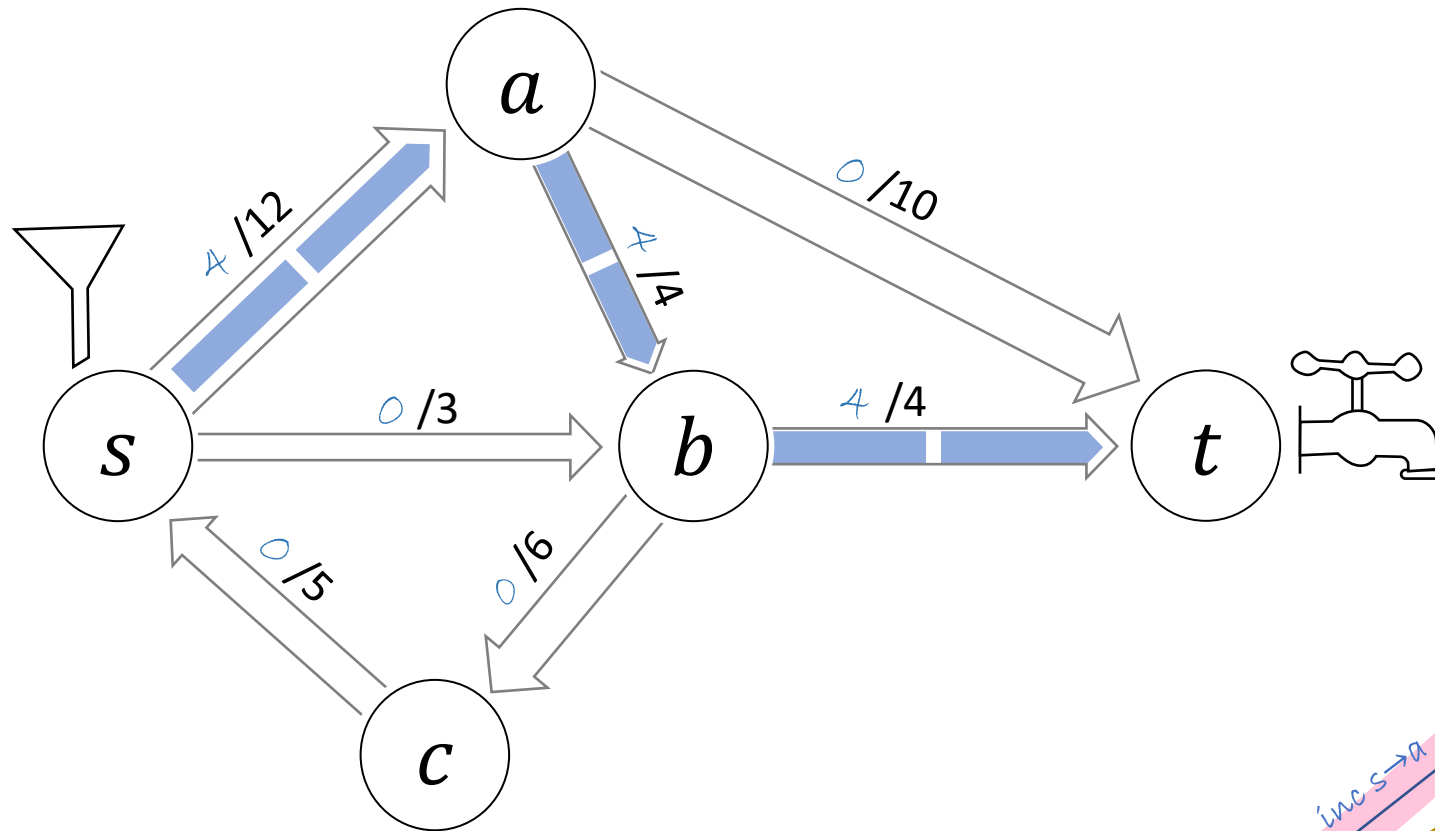


At  $b$ :  
 previously:  $\text{tot.in} - \text{tot.out} = 4 - 4 = 0$   
 after:  $\text{tot.in} - \text{tot.out} = 4 - 4 = 0$ .

# WALKTHROUGH OF FORD-FULKERSON



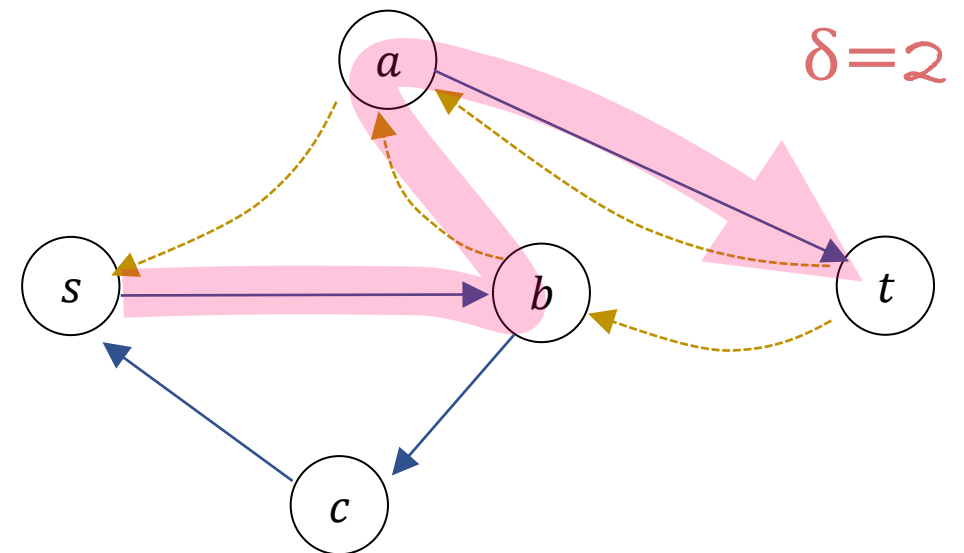
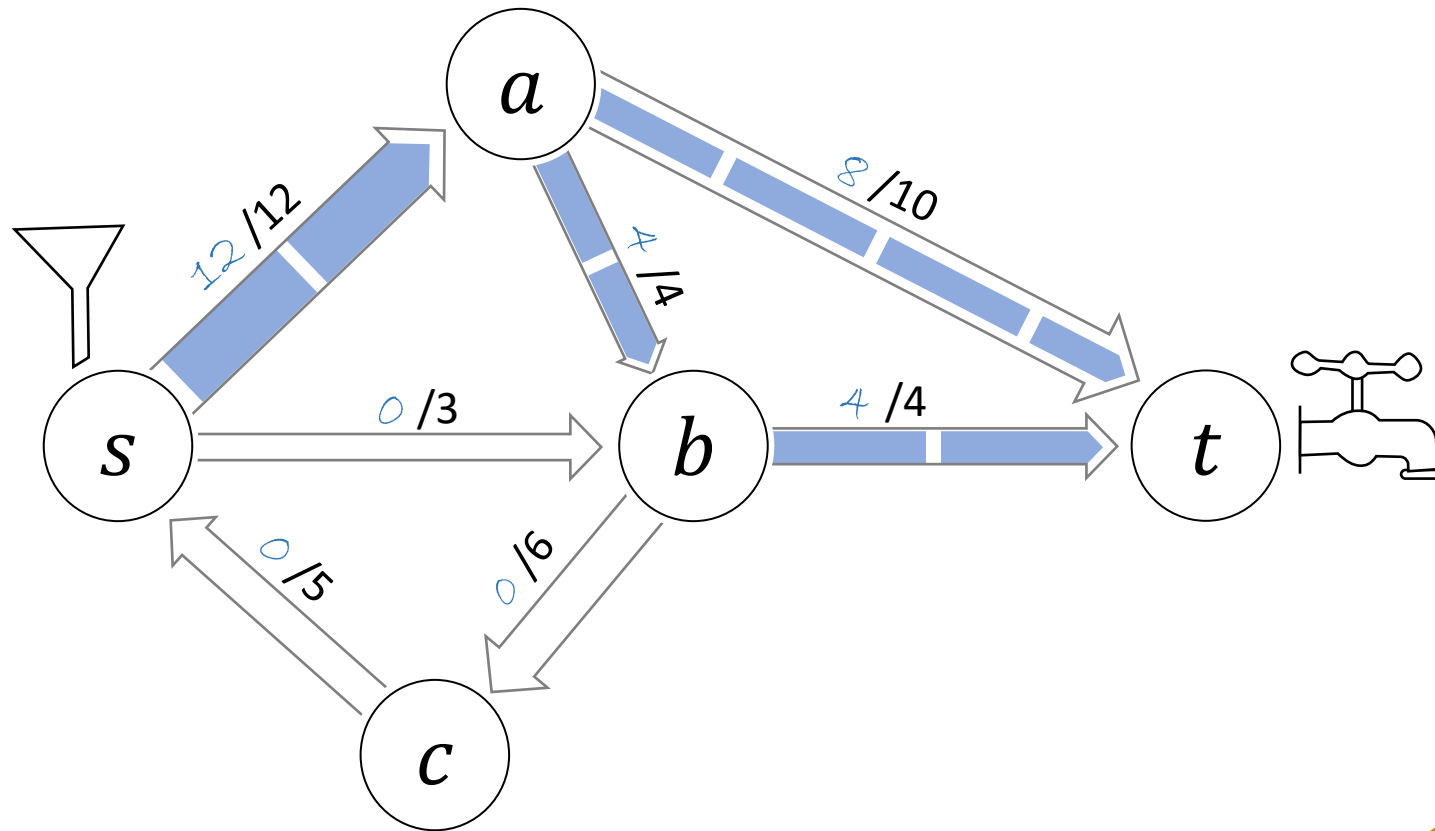
# WALKTHROUGH OF FORD-FULKERSON



## CRUCIAL TRICK

The residual graph doesn't have capacities, it just has edges, so we can use e.g. breadth-first search to find a path. We've reduced flow-finding to path-finding.

# WALKTHROUGH OF FORD-FULKERSON

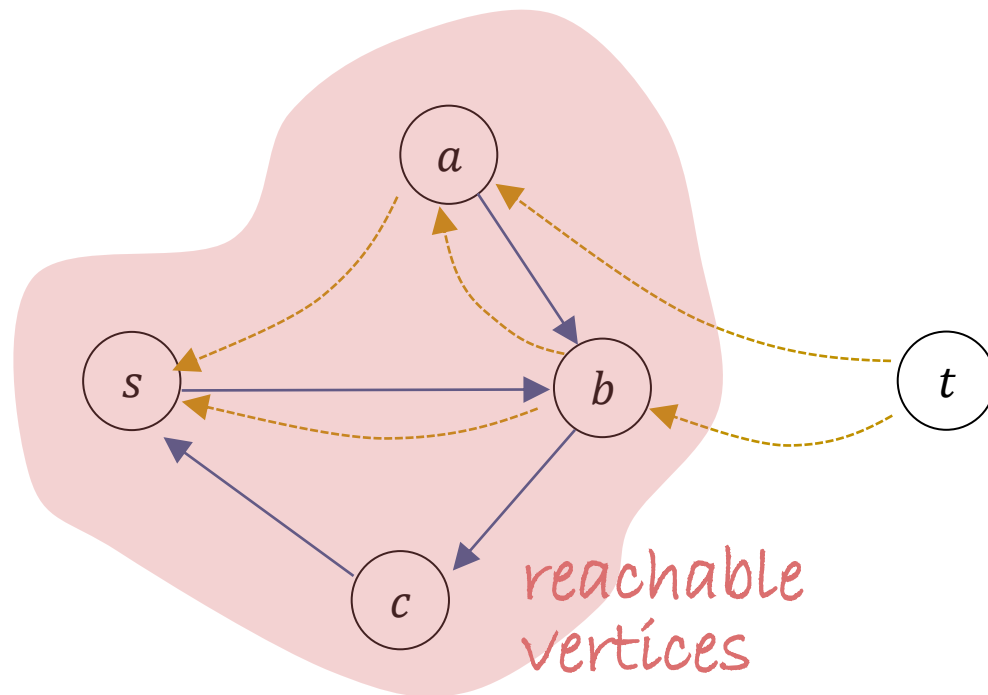
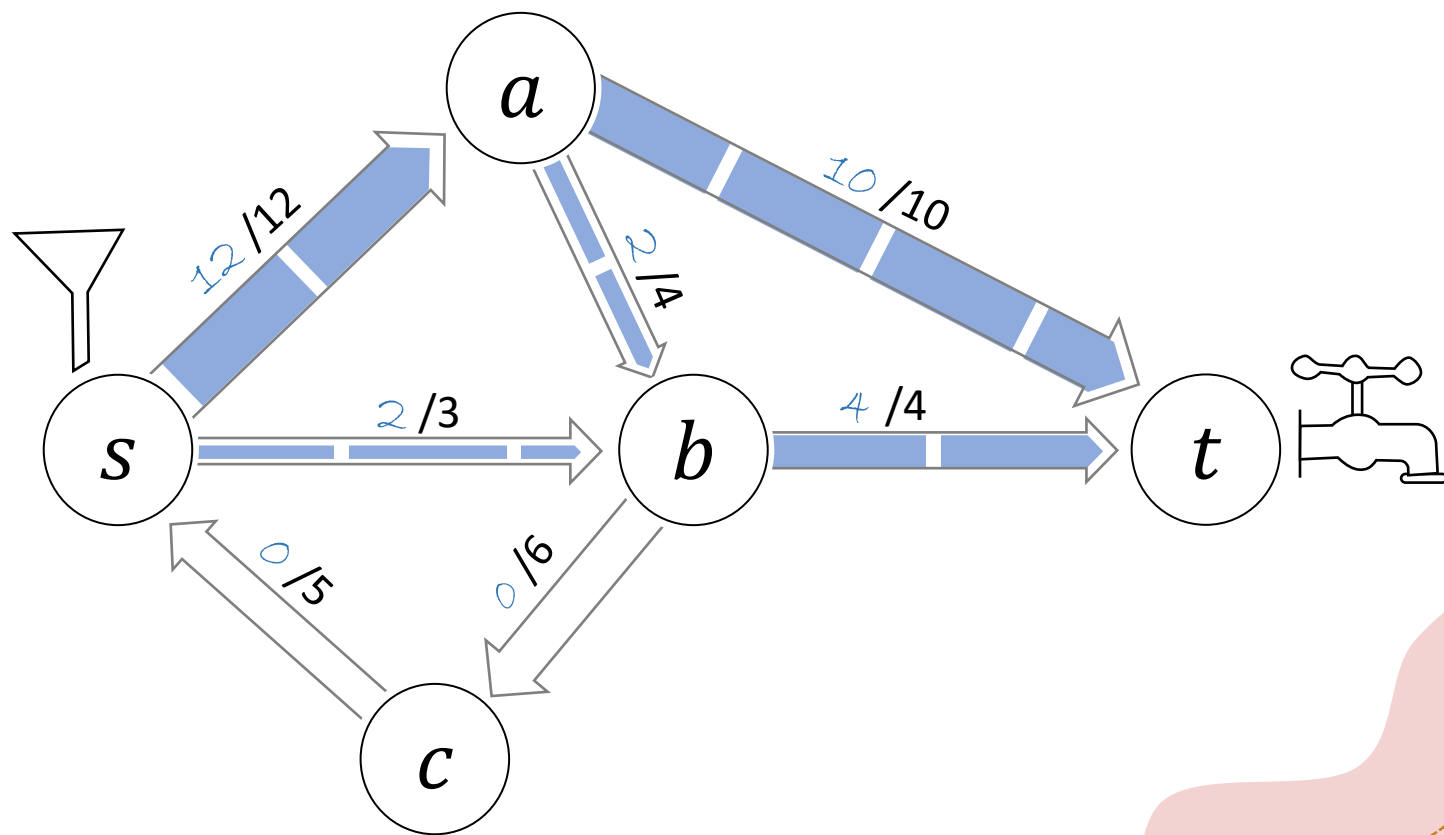


## CRUCIAL TRICK

The residual graph doesn't have capacities, it just has edges, so we can use e.g. breadth-first search to find a path. We've reduced flow-finding to path-finding.

# WALKTHROUGH OF FORD-FULKERSON

We cannot find an augmenting path in the residual graph. So, terminate.



## CRUCIAL TRICK

The residual graph doesn't have capacities, it just has edges, so we can use e.g. breadth-first search to find a path. We've reduced flow-finding to path-finding.



Assume capacities are all integer.

```
1 def ford_fulkerson(g, s, t):
2     # Let f be a flow, initially empty
3     for u → v in g.edges:
4         f(u → v) = 0    f is integer
5
6     # Define a helper function for finding an augmenting path
7     def find_augmenting_path():
8         # Define the residual graph h on the same vertices as g
9         for u → v in g.edges:
10            if f(u → v) < c(u → v): give h an edge u → v labelled "inc u → v"
11            if f(u → v) > 0: give h an edge v → u labelled "dec u → v"
12        if h has a path from s to t:
13            return some such path, together with the labels of its edges
14        else:
15            # Let S be the set of vertices the bandits can reach (used in the proof)
16            return None
17
18    # Repeatedly find an augmenting path and add flow to it
19    while True:
20        p = find_augmenting_path()
21        if p is None:
22            break
23        else:
24            compute δ, the amount of flow to apply along p, and apply it
25            # Assert: δ > 0    by construction of residual graph.
26            # Assert: f is still a valid flow
```

e.g. using BFS  
 $O(V+E)$

δ will be integer.

$O(V)$

total cost = # iterations  $\times O(V+E)$ .

δ is integer,  $\delta > 0 \therefore \delta \geq 1$ . So flow value changes by at least 1, and remains integer.

$\Rightarrow$  # iterations  $\leq$  max flow value  $< \infty$

**The Integrality Lemma.** If the capacities are all integers, then the algorithm terminates, and the resulting flow on each edge is an integer.



# Algorithms tick: max-flow

Deadline 11 March.

## Maximum flow with Ford-Fulkerson / Edmonds-Karp

In this tick you will build a Ford–Fulkerson implementation from scratch. In fact you will implement the Edmonds–Karp variant of Ford–Fulkerson, which uses breadth first search (BFS) to find augmenting paths, and which has  $O(VE^2)$  running time.



We gratefully acknowledge support from the Simons Foundation and University of Cambridge.

arXiv > cs > arXiv:2203.00671

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### Computer Science > Data Structures and Algorithms

[Submitted on 1 Mar 2022 (v1), last revised 22 Apr 2022 (this version, v2)]

# Maximum Flow and Minimum-Cost Flow in Almost-Linear Time

Li Chen, Rasmus Kyng, Yang P. Liu, Richard Peng, Maximilian Probst Gutenberg, Sushant Sachdeva

We give an algorithm that computes exact maximum flows and minimum-cost flows on directed graphs with  $m$  edges and polynomially bounded integral demands, costs, and capacities in  $m^{1+o(1)}$  time. Our algorithm builds the flow through a sequence of  $m^{1+o(1)}$  approximate undirected minimum-rate cycles, each of which is computed and processed in amortized  $m^{o(1)}$  time using a new dynamic graph data structure.

Our framework extends to algorithms running in  $m^{1+o(1)}$  time for computing flows that minimize general edge-separable convex functions to high accuracy. This gives almost-linear time algorithms for several problems including entropy-regularized optimal transport, matrix scaling,  $p$ -norm flows, and  $p$ -norm isotonic regression on arbitrary directed acyclic graphs.

Subjects: **Data Structures and Algorithms (cs.DS)**  
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<https://doi.org/10.48550/arXiv.2203.00671>

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$\forall \epsilon > 0 \exists \kappa, m_0.$   
 $\forall m \geq m_0,$   
runtime  $\leq \kappa m^{1+\epsilon}$

*m edges*