

Announcements

Announcements

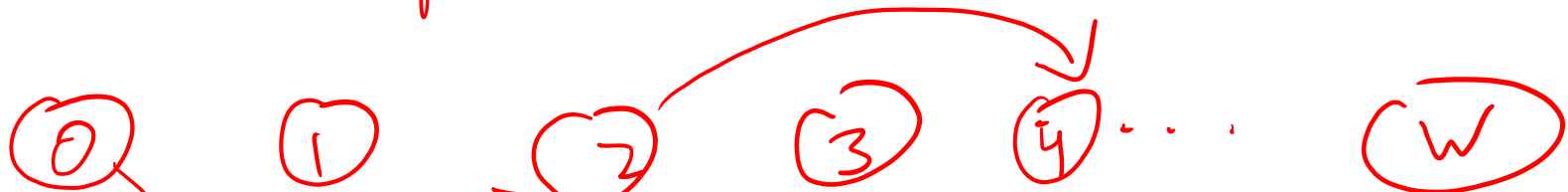
- Sign up for exam time if you haven't yet done so!
- Exam questions will be posted on Sunday
 - Some material from today/Tuesday will be included, so you may not be able to do all of it immediately
- Same procedure as last time
- Any questions?

greedy, DP, network flows (LP)

KP w/out rep
All-pairs s.p. } 2-dimensional
DAG / 2-d array

Dynamic Programming

KP w/repetition longest path from 0



$i \rightarrow j$ if some item had
weight = $j - i$, weight
of edge = value of item

Knapsack without Repetition

- Same as before, except now you can't have multiple copies of an item.
- Are subproblems from before still useful?

↓
what is max val I can get
with a total weight of exactly
i?

not useful now, because it
doesn't track which items already
used

Knapsack without Repetition

- Same as before, except now you can't have multiple copies of an item.
- Are subproblems from before still useful?
- Define $K(w, j)$ = maximum achievable with capacity of w , using only items $1, \dots, j$
- What is the value of $K(w, j)$?

total weight
↑

value

choosing from

Knapsack without Repetition

- Same as before, except now you can't have multiple copies of an item.
- Are subproblems from before still useful?
- Define $K(w, j)$ = maximum achievable with capacity of w , using only items $1, \dots, j$
- What is the value of $K(w, j)$?

The recurrence formula is shown with handwritten red annotations. The formula is $K(w, j) = \max\{K(w - w_j, j - 1) + v_j, K(w, j - 1)\}$. The term $K(w, j)$ is circled in red. The first term inside the max, $K(w - w_j, j - 1) + v_j$, is also circled in red, with a red arrow pointing to it from the text "choose to include item j". The second term, $K(w, j - 1)$, is circled in red, with a red arrow pointing to it from the text "do not include item j".

$$K(w, j) = \max\{K(w - w_j, j - 1) + v_j, K(w, j - 1)\}$$

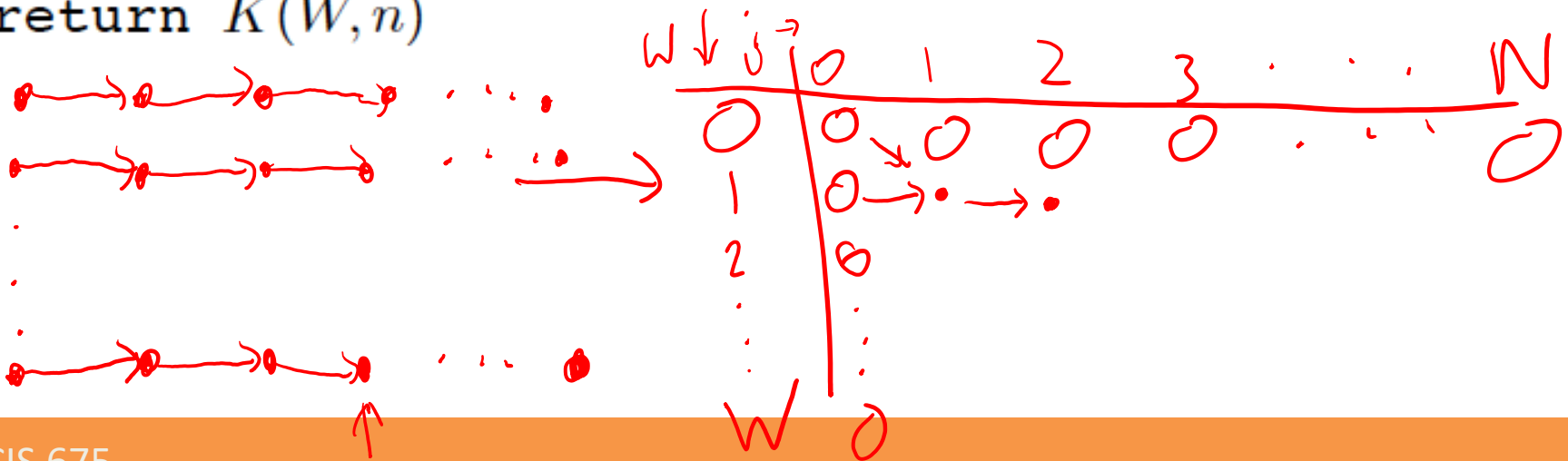
choose to include item j

do not include item j

Knapsack without Repetition

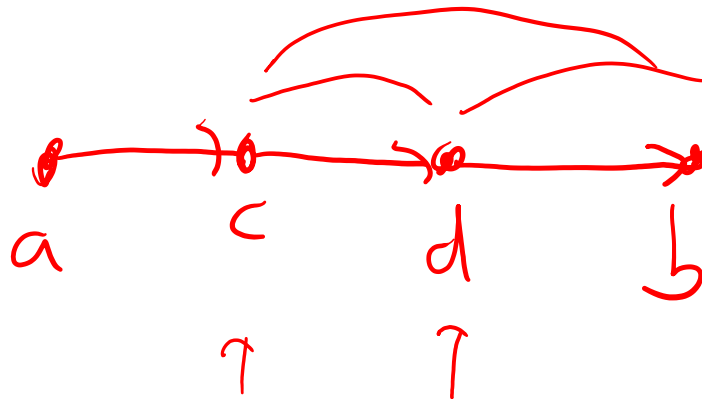
$w_1 = 1$ $K(w, 3)$ $K(1, 1)$ depends on
 $K(w, 4)$ $K(w - w_1, 3)$ $K(1, 0)$ and $K(1 - w_1, 0)$

Initialize all $K(0, j) = 0$ and all $K(w, 0) = 0$
 for $j = 1$ to n : n iterations
 for $w = 1$ to W : W iterations $O(n \cdot W)$
 if $w_j > w$: $K(w, j) = K(w, j - 1)$
 else: $K(w, j) = \max\{K(w, j - 1), K(w - w_j, j - 1) + v_j\}$
 return $K(W, n)$



All-Pairs Shortest Paths

- Given the adjacency matrix of a weighted, directed graph G
- We want to find the shortest path length between *each pair* of nodes
- One solution: run Dijkstra's from each node as source
 - Too slow!



All-Pairs Shortest Paths: the Floyd-Warshall Algorithm

- Idea: use a shortest path matrix M to keep track of all-pairs shortest path lengths (APSPLs)
- M^i corresponds to the state of matrix M at the beginning of step i
- Define an intermediate vertex on a shortest path as a node that is not the source or destination
- Subproblem: In each ^{iteration}~~step~~ i , we want to find the APSPLs that use only nodes $1, \dots, i$ as intermediate nodes

All-Pairs Shortest Paths: the Floyd-Warshall Algorithm

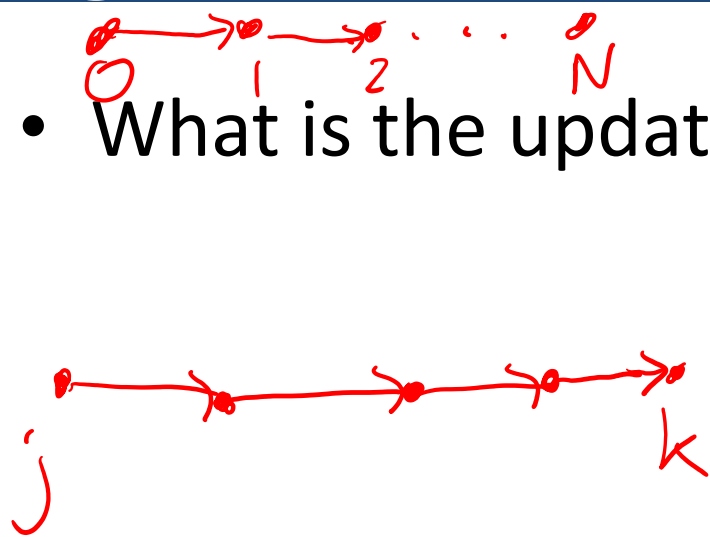
- Subproblem: In each step i , we want to find the APSPLs that use only nodes $1, \dots, i$
- What is the initial value of M ?
- What is the update equation for M_{jk}^i ?

M^0 represents cases where we are not allowed to use any int. verts.

$M_{ij}^0 = \text{weight of edge } (i,j) \text{ if such an edge exists, } \infty \text{ otherwise}$

All-Pairs Shortest Paths: the Floyd-Warshall Algorithm

- What is the update equation for M^i_{jk} ? ←



N iterations
Each iter is
 $O(N^2)$ time,
total
 $O(N^3)$

M^x for $x < i$
↓
s.p.l. from $j \rightarrow k$
using only nodes
from $\{1, \dots, i\}$ as
inter. verts.

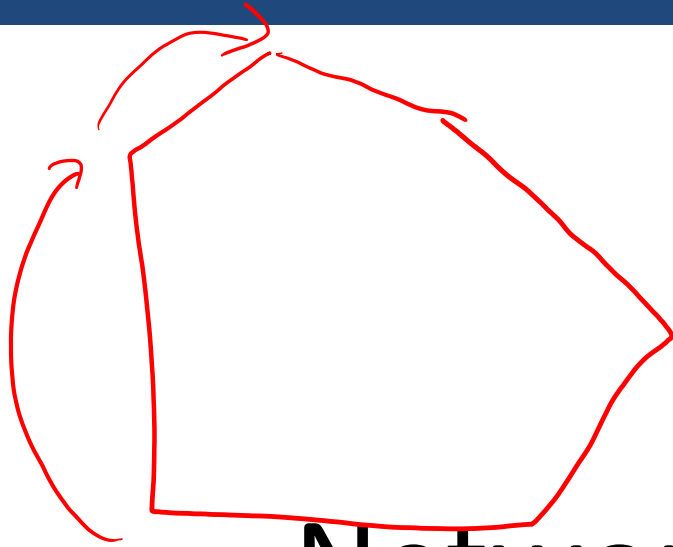
2 possibilities:

1. don't use node i , then $M^i_{jk} = M^{i-1}_{jk}$ ✓

2. do use node i . The path looks like



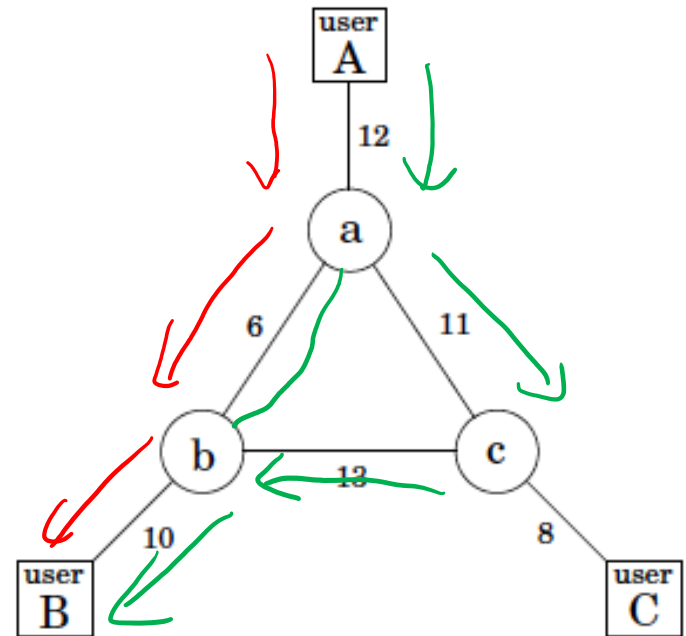
$M^i_{jk} = M^{i-1}_{ji} + M^{i-1}_{ik}$ ✓



Network Flows

Allocating Bandwidth

- Need to allocate bandwidth to connect A-B, B-C, and A-C
- A-B pays \$3 per unit of bandwidth, B-C pays \$2, and A-C pays \$4
- Can connect via long path or short path
- *pair of users* Each ~~connection~~ must have at least 2 units of bandwidth
- Each edge has a maximum capacity



Allocating Bandwidth

- Each connection can use the long path or short path: consider each possibility

obj. function

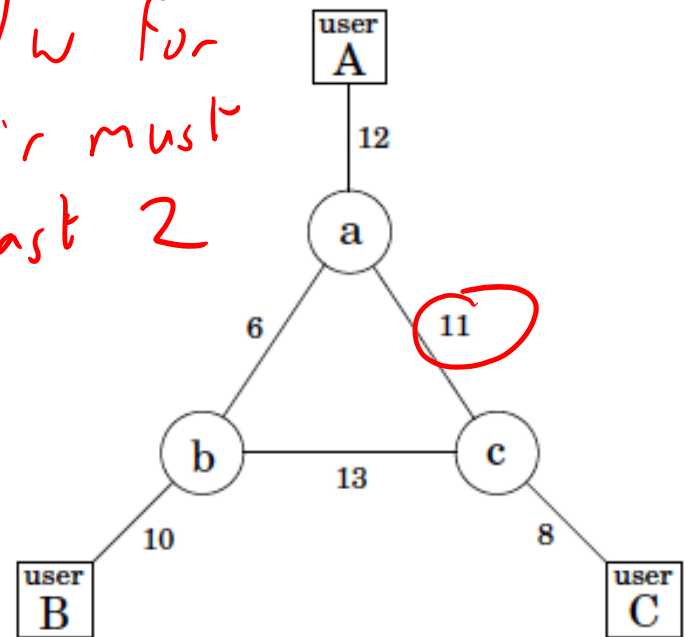
$$\max 3x_{AB} + 3x'_{AB} + 2x_{BC} + 2x'_{BC} + 4x_{AC} + 4x'_{AC}$$

x_{AB} = amount of b/w alloc. to A/B along short path

$$\begin{cases} x_{AB} + x'_{AB} \geq 2 \\ x_{BC} + x'_{BC} \geq 2 \\ x_{AC} + x'_{AC} \geq 2 \end{cases}$$

total b/w for each pair must be at least 2

x'_{AB} = amount allocated to A/B along long path



Allocating Bandwidth

- There are bandwidth constraints on each edge

$$x_{AB} + x'_{AB} + x_{BC} + x'_{BC} \leq 10$$

$$x_{AB} + x'_{AB} + x_{AC} + x'_{AC} \leq 12$$

$$x_{BC} + x'_{BC} + x_{AC} + x'_{AC} \leq 8$$

$$x_{AB} + x'_{BC} + x'_{AC} \leq 6$$

$$x'_{AB} + x_{BC} + x'_{AC} \leq 13$$

$$x'_{AB} + x'_{BC} + x_{AC} \leq 11$$

[edge (b, B)]

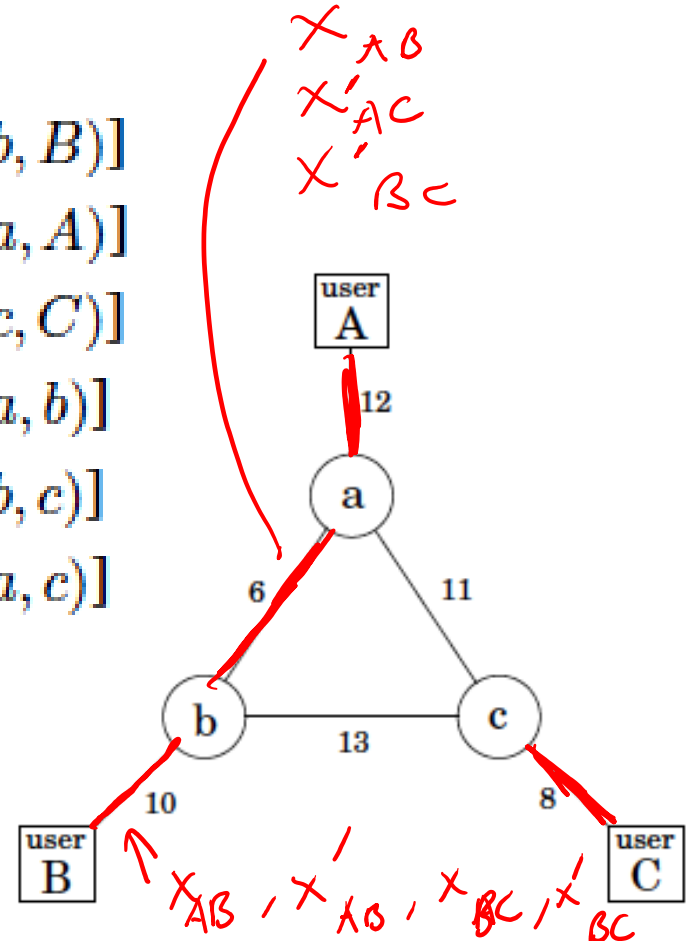
[edge (a, A)]

[edge (c, C)]

[edge (a, b)]

[edge (b, c)]

[edge (a, c)]



Allocating Bandwidth: Putting it Together

$$\max \quad 3x_{AB} + 3x'_{AB} + 2x_{BC} + 2x'_{BC} + 4x_{AC} + 4x'_{AC}$$

$$x_{AB} + x'_{AB} + x_{BC} + x'_{BC} \leq 10$$

$$x_{AB} + x'_{AB} + x_{AC} + x'_{AC} \leq 12$$

$$x_{BC} + x'_{BC} + x_{AC} + x'_{AC} \leq 8$$

$$x_{AB} + x'_{BC} + x'_{AC} \leq 6$$

$$x'_{AB} + x_{BC} + x'_{AC} \leq 13$$

$$x'_{AB} + x'_{BC} + x_{AC} \leq 11$$

$$x_{AB} + x'_{AB} \geq 2$$

$$x_{BC} + x'_{BC} \geq 2$$

$$x_{AC} + x'_{AC} \geq 2$$

$$x_{AB}, x'_{AB}, x_{BC}, x'_{BC}, x_{AC}, x'_{AC} \geq 0$$

capacity
constraints

Network Flows

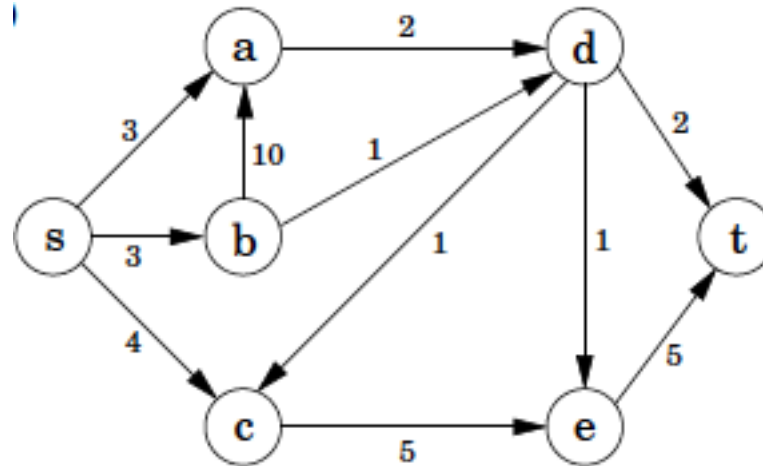
- What happens as the number of nodes in the previous problem becomes large?

*number of constraints ↑
not an efficient solution!*

- Better solution: network flow algorithms

Network Flows

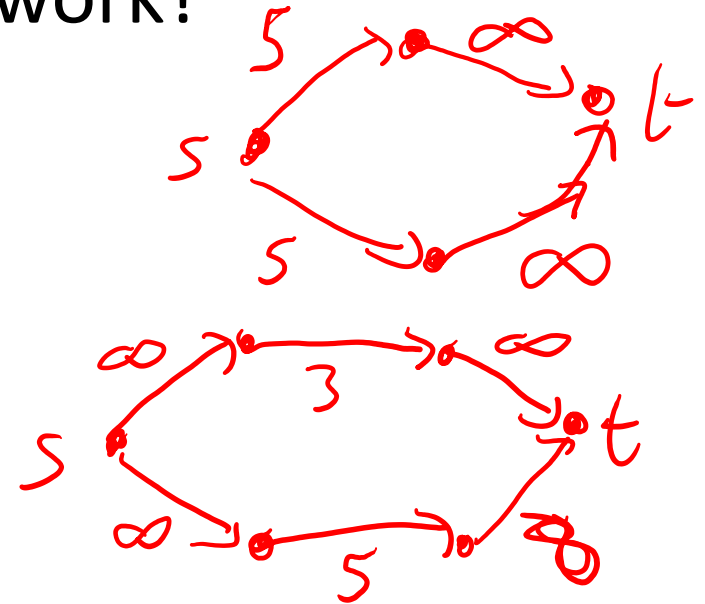
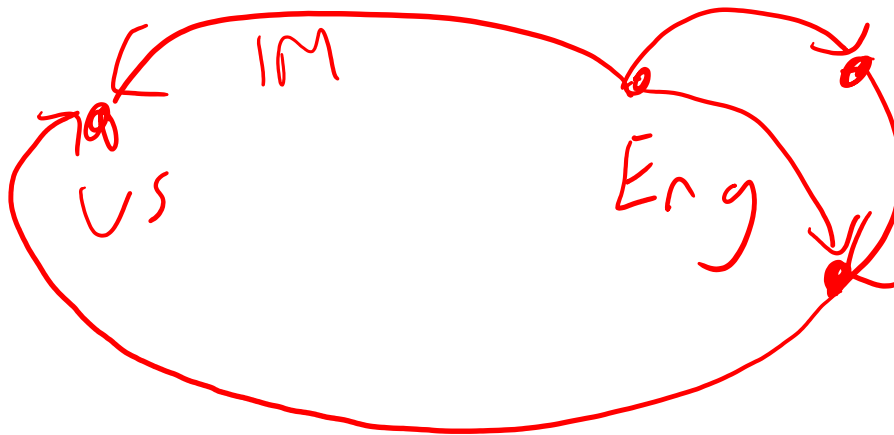
- You are given a network with capacities on the edges



- Goal is to decide how much flow to send along each edge, to maximize total amount from s to t

Examples of Network Flows

- How many products can we ship from England to the US, given the current set of flights?
- How much data can we send from one computer to another, given current network?



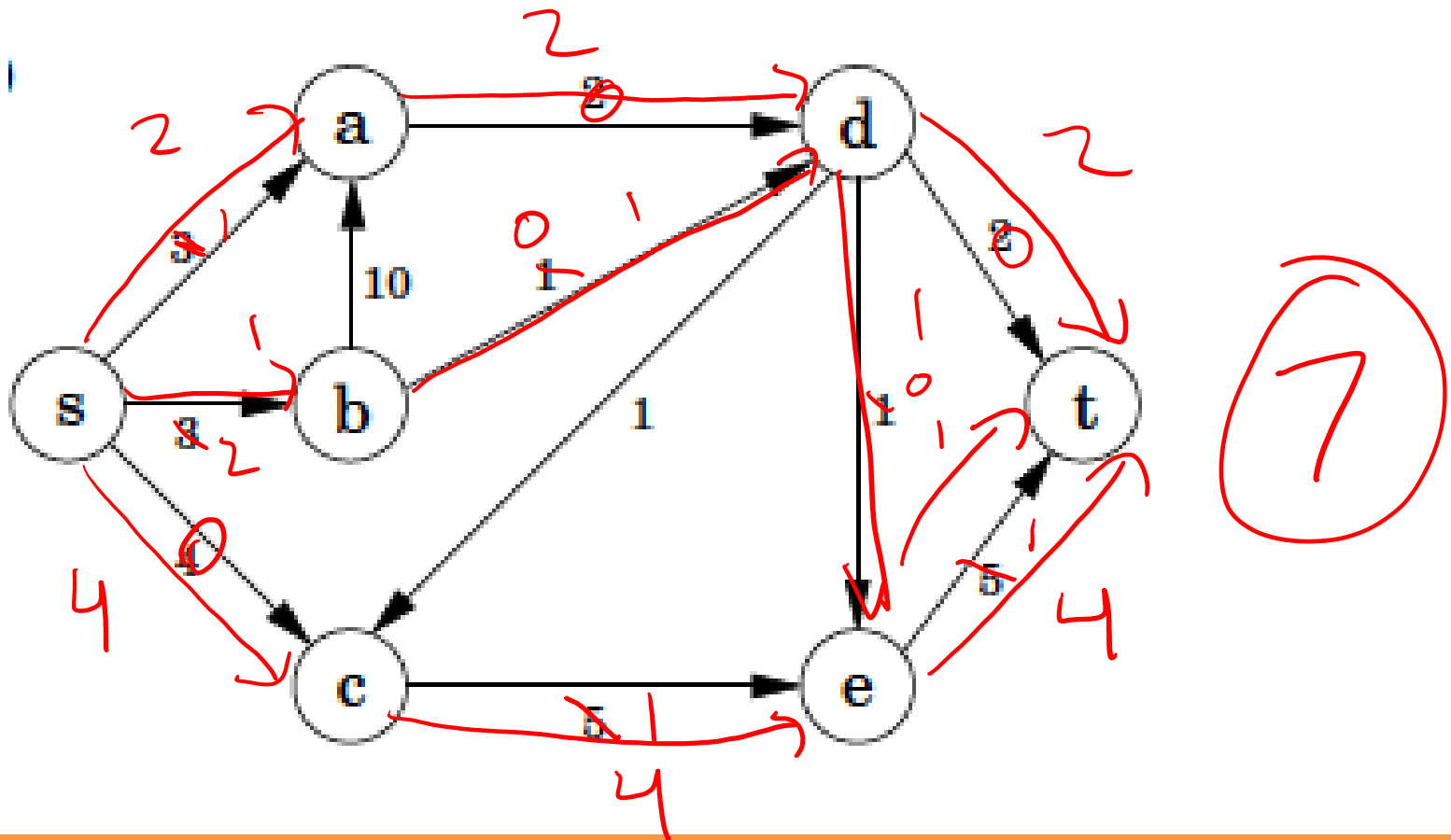
Rules of Network Flows

- The flow sent along an edge cannot exceed the total capacity of that edge *constraint*
- The total amount of flow entering a node must equal the amount of flow leaving a node, *excepting source + target/sink*
- This is a linear programming problem!

↓
*not efficient to
view it like this!*

In-Class Exercise

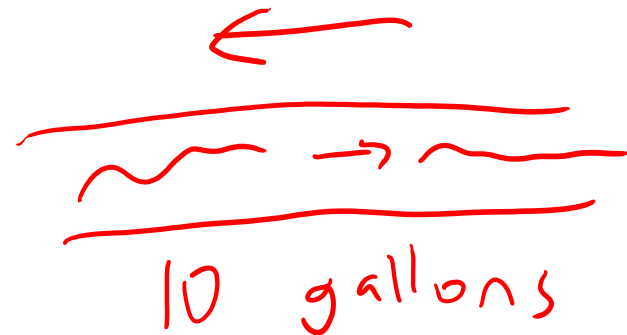
Find the maximum amount of flow from s to t



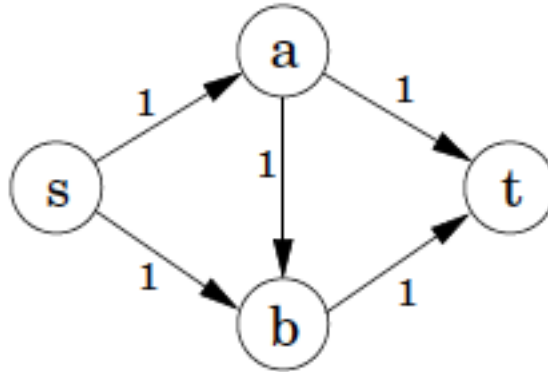
The Ford-Fulkerson Network Flow Algorithm

- Choose a path from S to T — doesn't matter which path (except for efficiency)
- Send as much flow as possible along that path
- Rules of path selection:
 - You can use an edge if there is capacity left
 - You can *reverse* flow sent along an edge

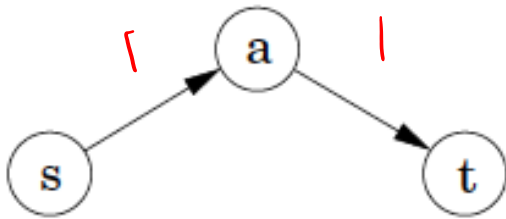
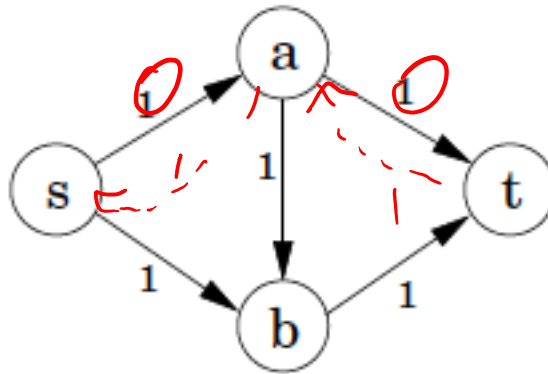
min capacity of an edge along path



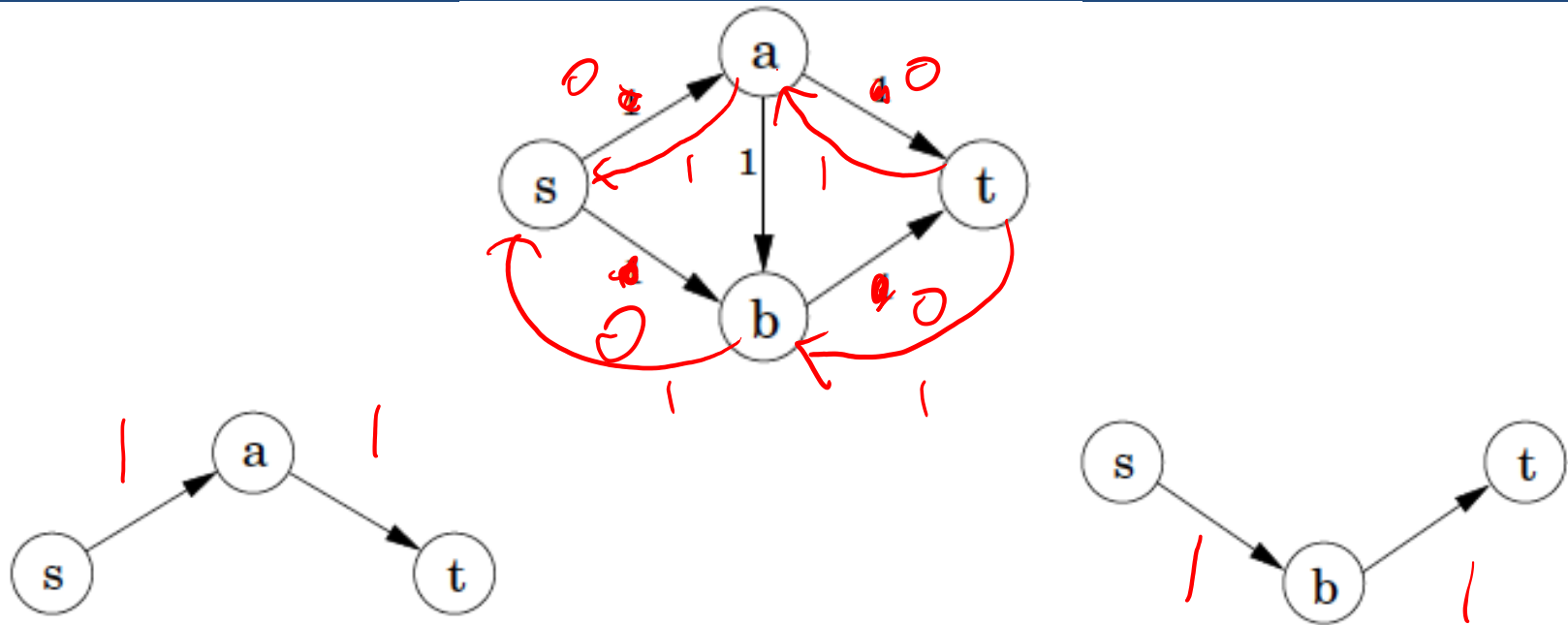
Sketch of Network Flow Algorithm



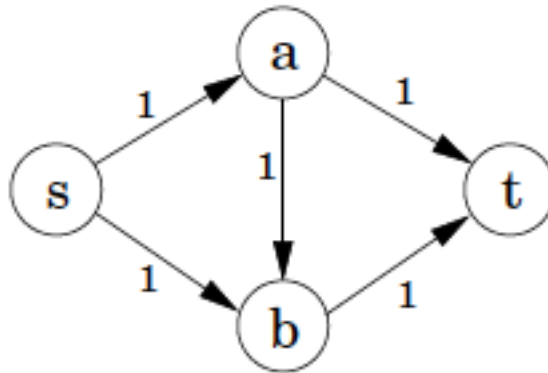
Sketch of Network Flow Algorithm



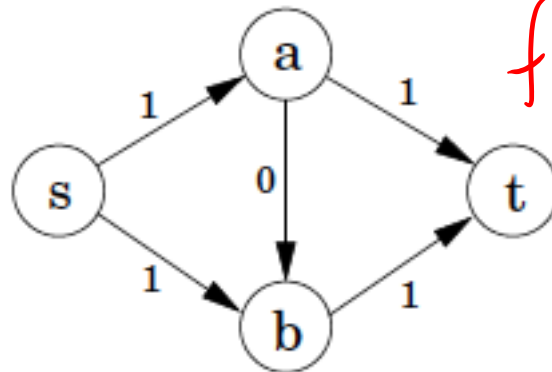
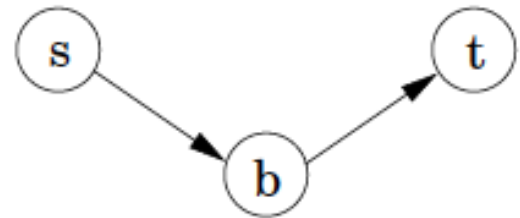
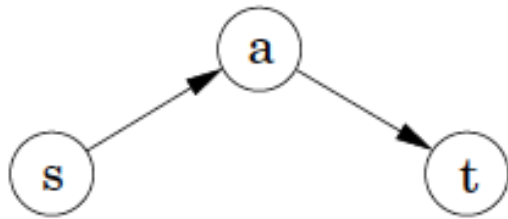
Sketch of Network Flow Algorithm



Sketch of Network Flow Algorithm

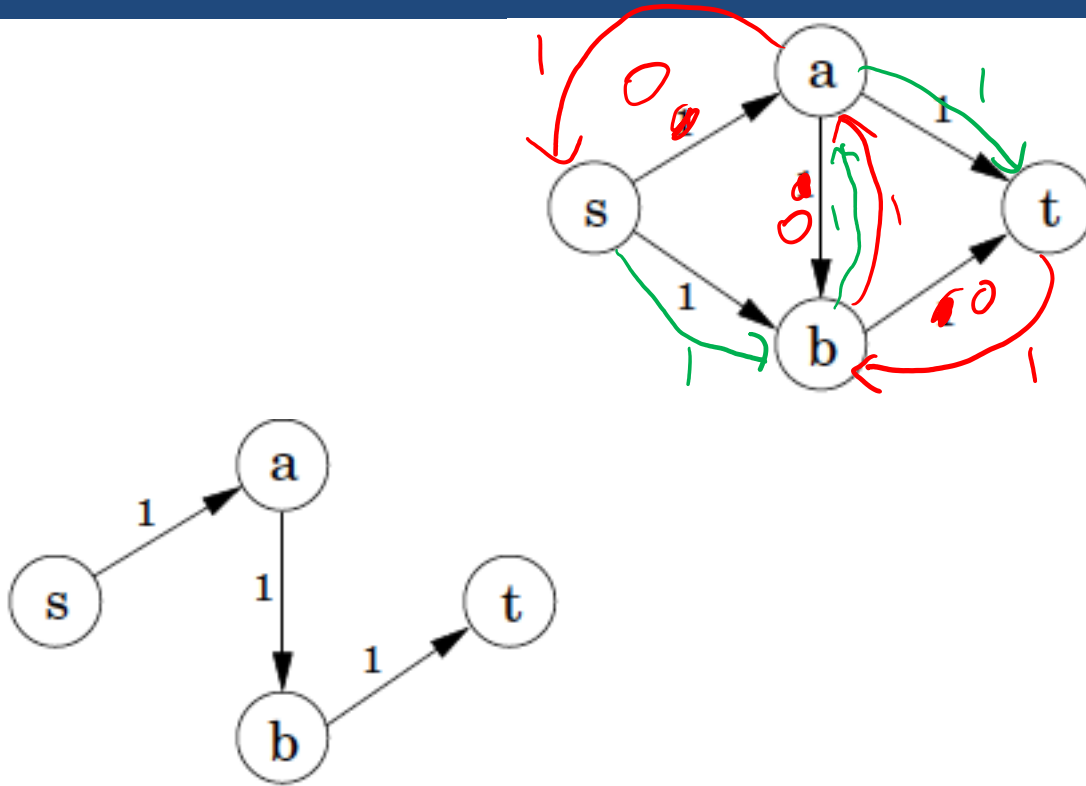


capacity
graph

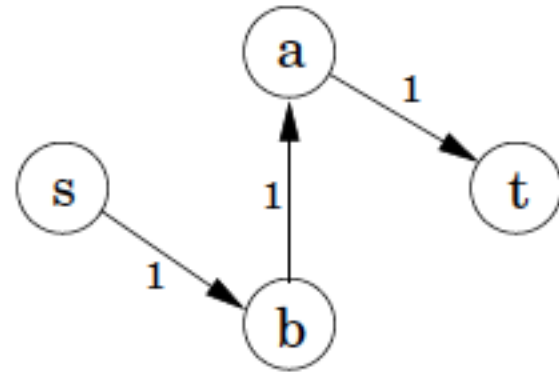
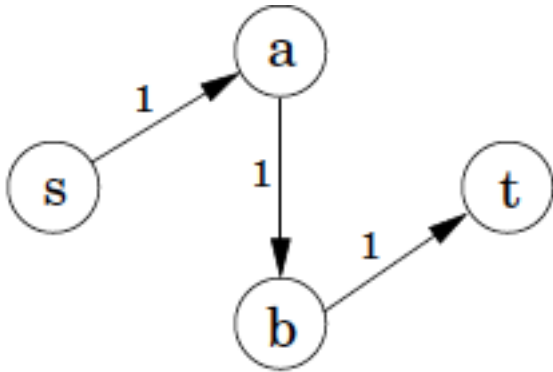
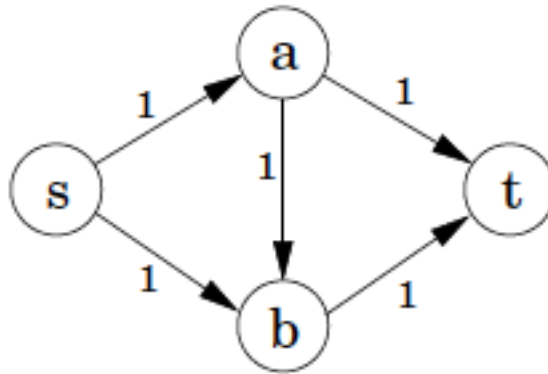


flow
graph

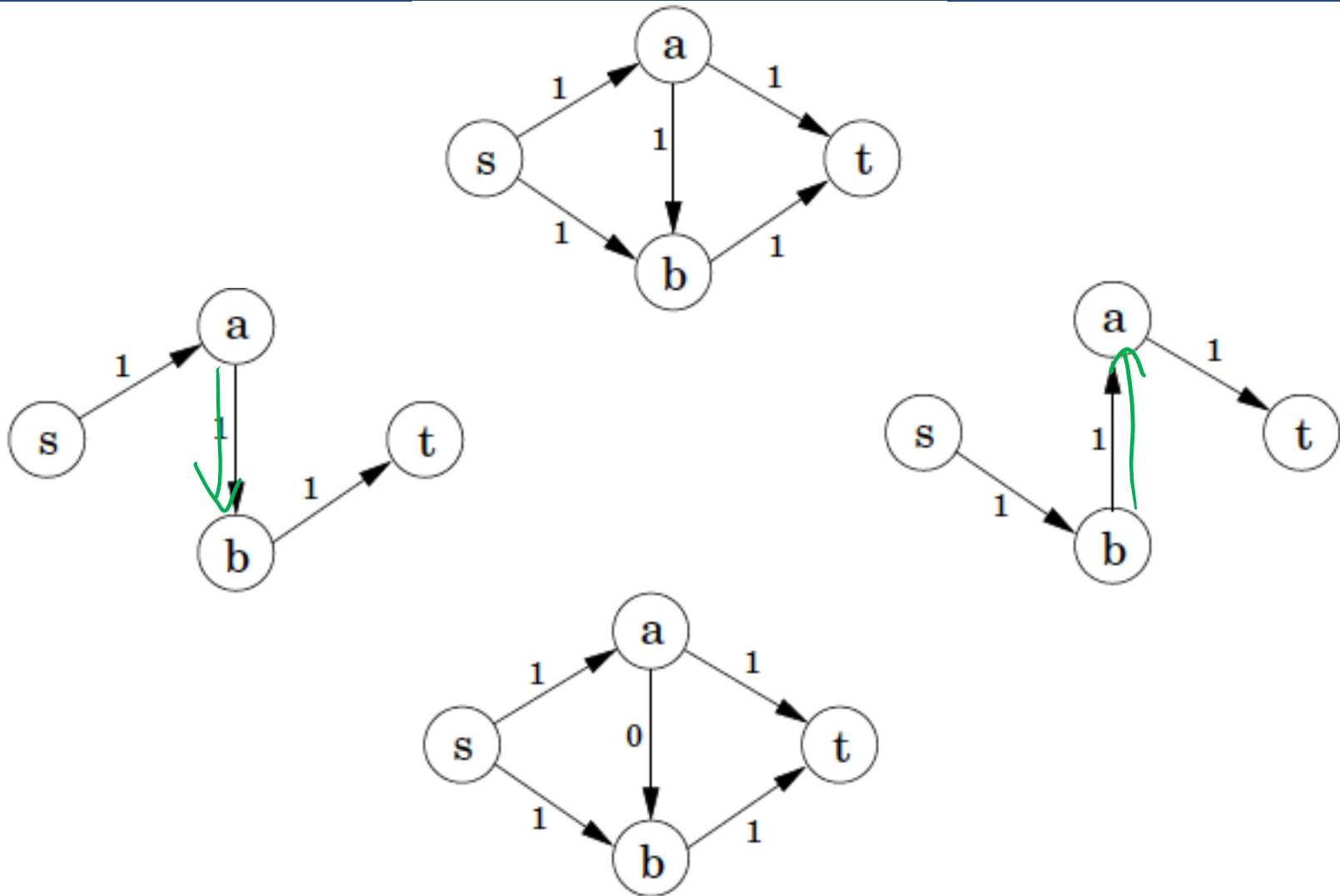
Sketch of Network Flow Algorithm



Sketch of Network Flow Algorithm



Sketch of Network Flow Algorithm



Network Flow Example

Find the maximum amount of flow from s to t

