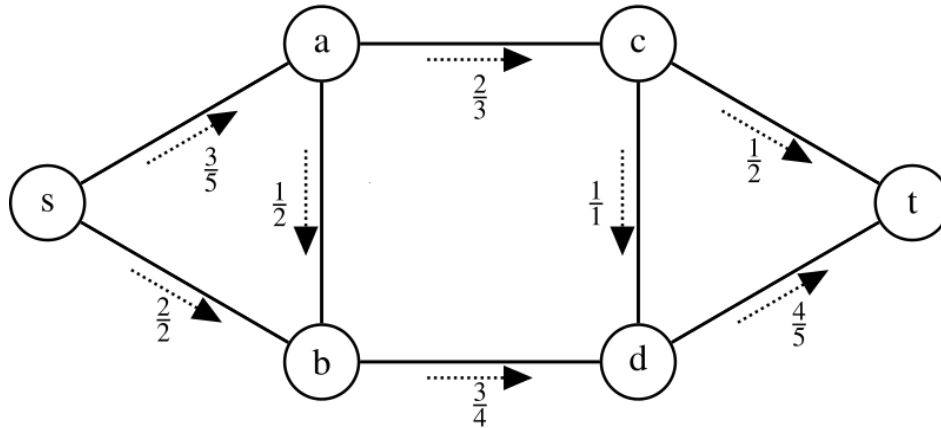


Lecture 19

Network Flow 1

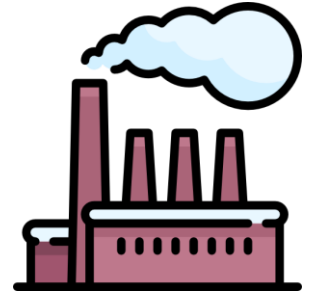


Announcements

- ❖ **Homework 6 Reflection** due this Sunday night (4/19)
- ❖ **Homework 7** due this Sunday night (4/19)
- ❖ **Group Project** problems posted this week
 - ❖ Each group will choose a problem (from a Google Doc)
 - ❖ Give a 10-20 minute presentation
 - ❖ Introduce Problem (why it's cool or useful)
 - ❖ Sketch and analyze a baseline solution
 - ❖ Design an efficient algorithm
 - ❖ Analyze aspects of your algorithm (running time, correctness, etc.)
 - ❖ Give an example of how it works

Trains and Grain

We want to send grain to the factory



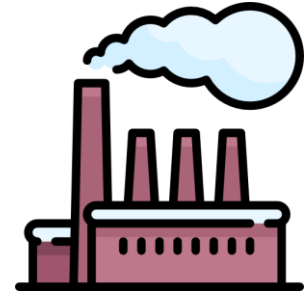
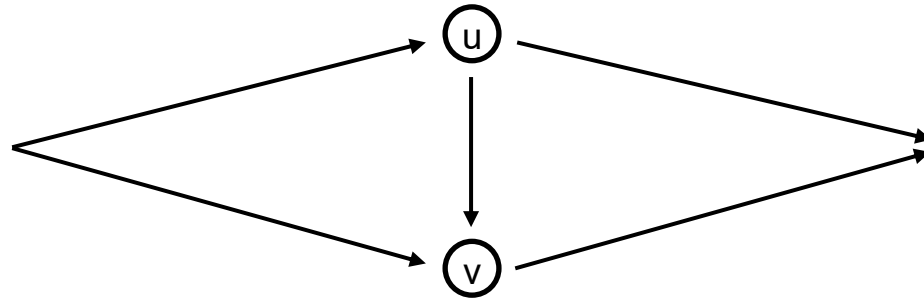
Trains and Grain

We want to send grain to the factory

- ❖ Along the train lines
- ❖ Can only send one train per line per day



s



t

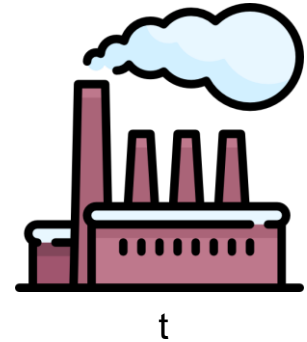
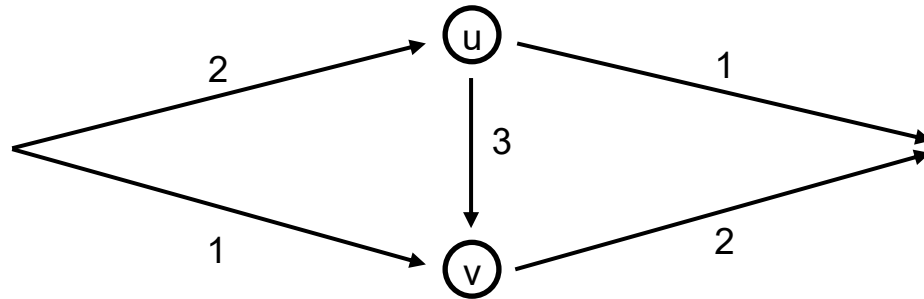
Trains and Grain

We want to send grain to the factory

- ❖ Along the train lines
- ❖ Can only send one train per line per day
- ❖ Each line has a weight limit of how much grain its train can carry



s



t

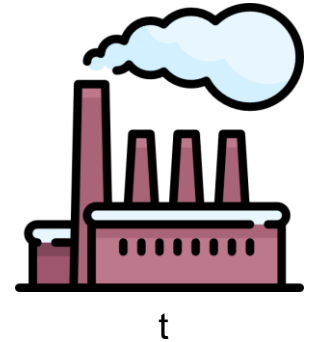
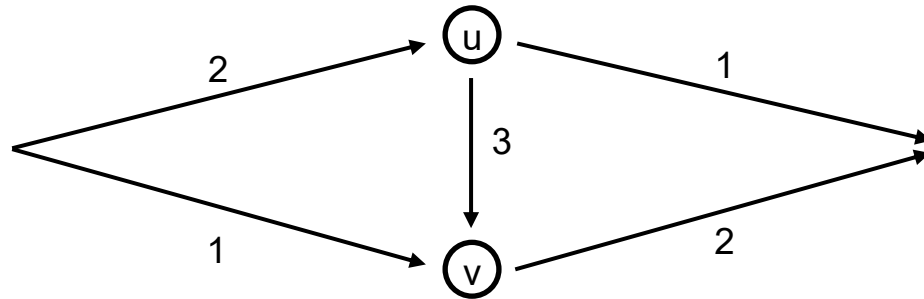
Trains and Grain

We want to send grain to the factory

- ❖ Along the train lines
- ❖ Can only send one train per line per day
- ❖ Each line has a weight limit of how much grain its train can carry
- ❖ What is the most grain can we get to the factory each day?



s



t

Network Flow Problems

A specific class of problems with many applications

Uses tools from the paradigms we've studied

- ❖ Greedy, D&C, Dynamic Programming

Direct applications: moving things around

- ❖ People on a commuter train

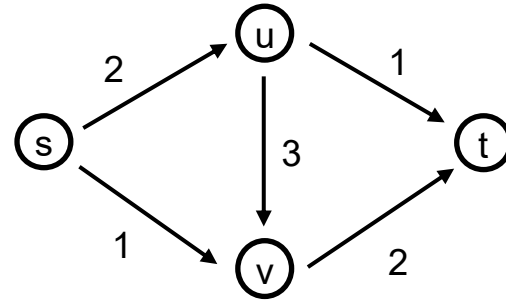
- ❖ Packets on the internet

- ❖ Natural gas through pipes

Formalize our Problem

Problem input is a network

- ❖ Directed graph
- ❖ Source vertex s
- ❖ Target vertex t
- ❖ Edge capacities $c(e) \geq 0$

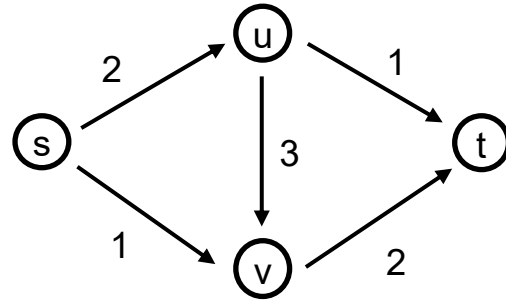


Formalize our Problem

A **network flow** is an assignment of values $f(e)$ to each edge e , which satisfies:

- ❖ Capacity: $0 \leq f(e) \leq c(e)$ for all e
- ❖ Flow conservation:

$$\sum_{e \text{ into } v} f(e) = \sum_{e \text{ out of } v} f(e)$$



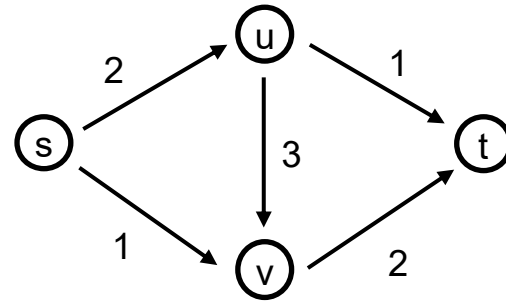
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- ❖ **Value** $v(f)$ of flow f is total flow on edges leaving source



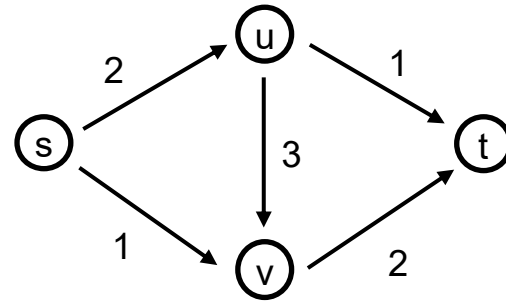
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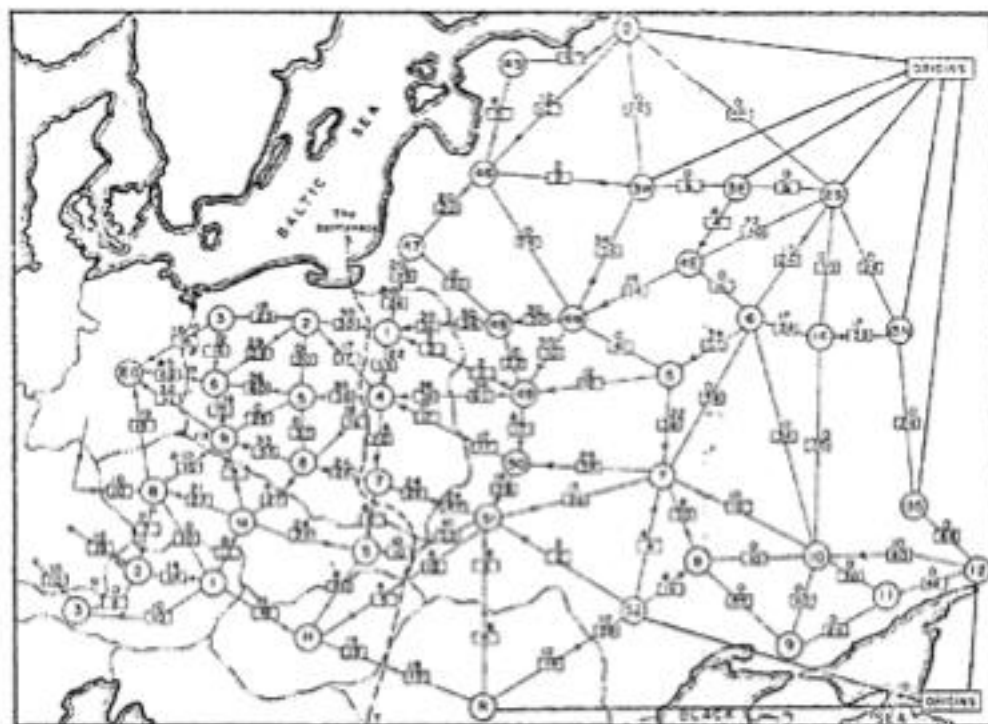
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- ❖ Flow conservation:

$$\sum_{e \text{ into } v} f(e) = \sum_{e \text{ out of } v} f(e)$$

- ❖ **Value** $v(f)$ of flow f is total flow on edges leaving source
- ❖ **Problem:** find a flow of maximum value

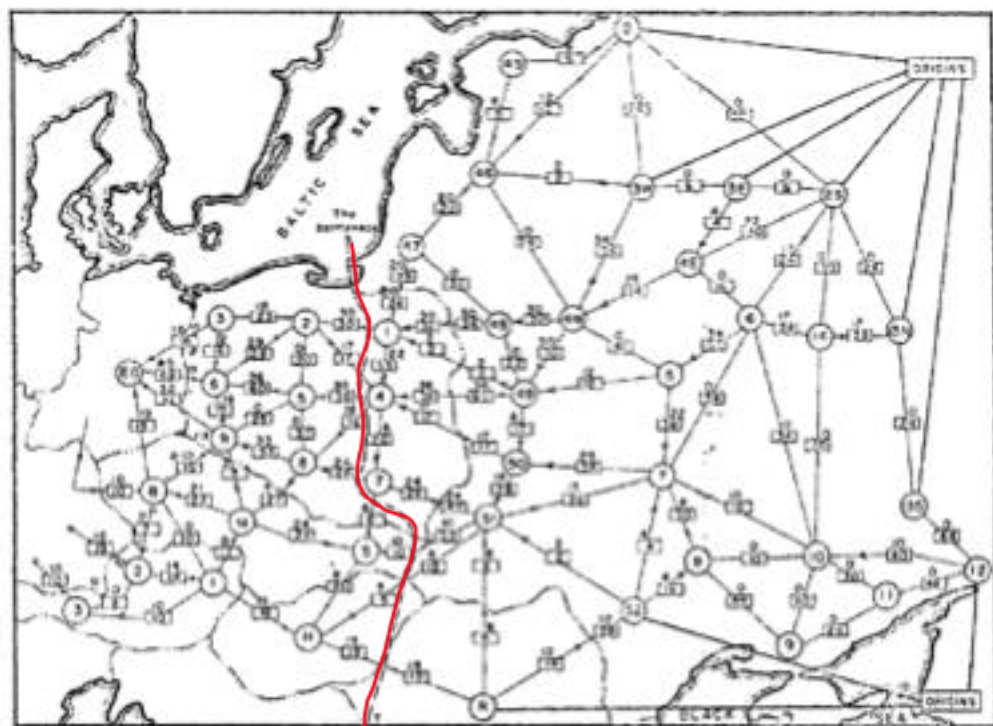


Soviet Rail Network, 1955



Reference: *On the history of the transportation and maximum flow problems.*
Alexander Schrijver in *Math Programming*, 91: 3, 2002.

Soviet Rail Network, 1955

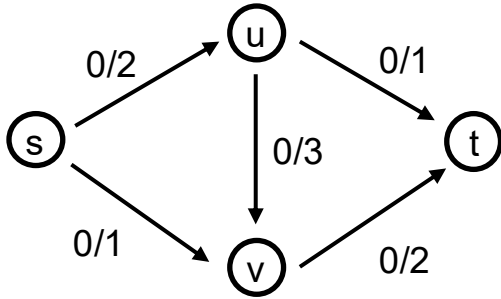


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Max-Flow Algorithm

First idea: initialize zero flow then repeatedly augment flow on paths from source to target

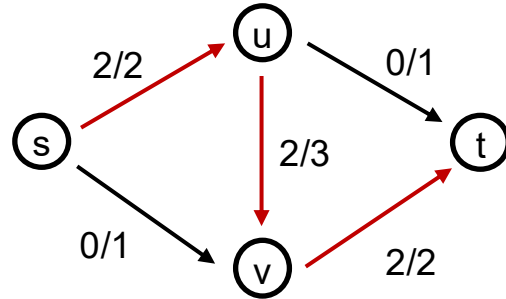
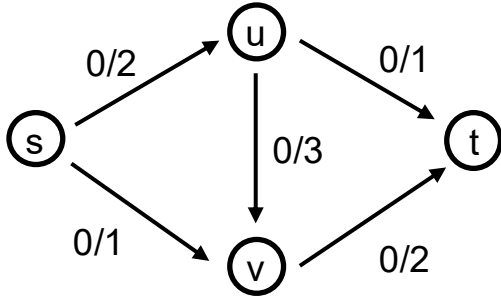
❖ Do this until we exhaust options



Max-Flow Algorithm

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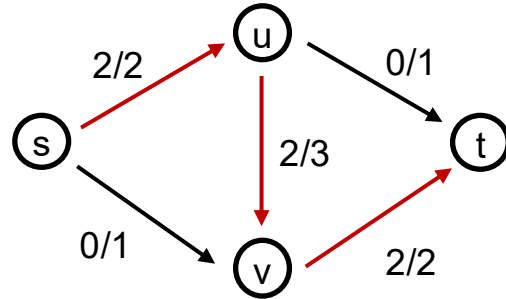
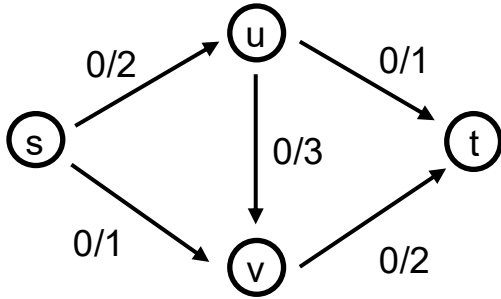
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Max-Flow Algorithm

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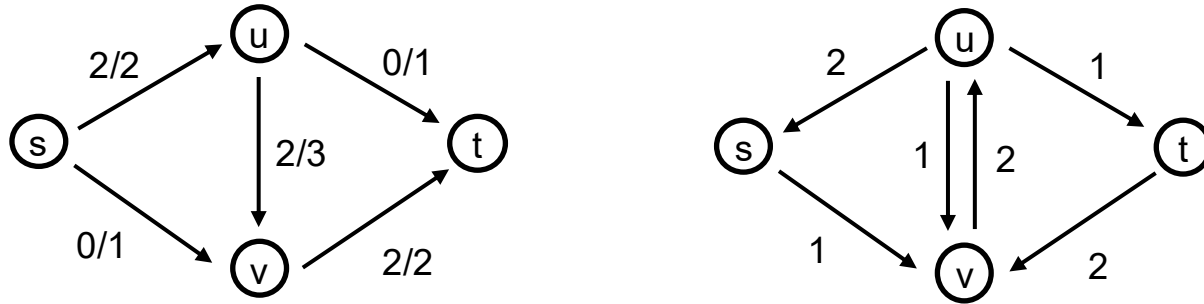
❖ Do this until we exhaust options



❖ Problem: we're stuck! All s - t paths have a **saturated** edge

Residual Graphs

The **residual graph** G_f identifies ways to increase flow on edges with leftover capacity

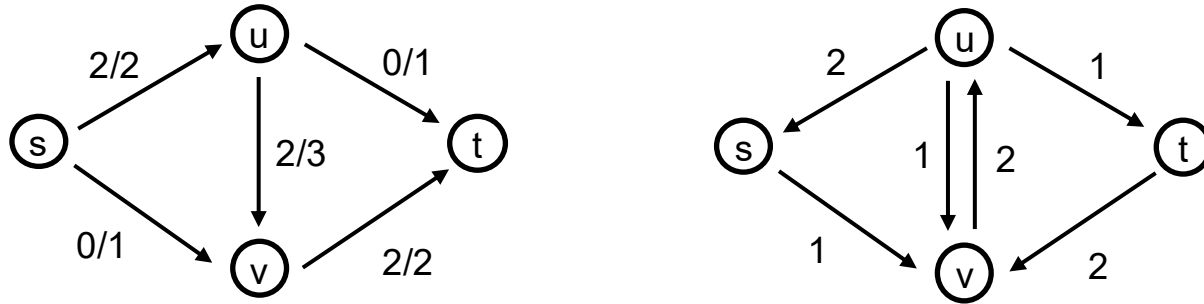


For each original edge $e = (u, v)$, the residual graph has

- ❖ A forward edge $e = (u, v)$ with residual capacity $c(e) - f(e)$
- ❖ A reverse edge $e' = (v, u)$ with residual capacity $f(e)$
- ❖ Omit edges with zero residual capacity

Residual Graphs

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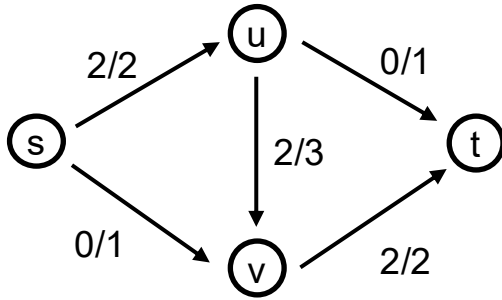
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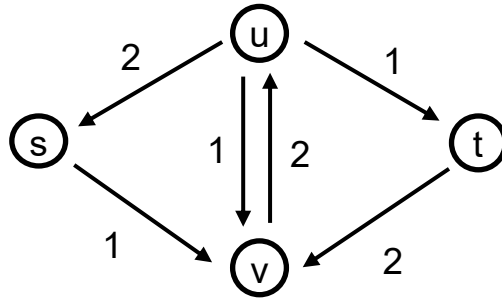
Key data structure
for network flows

Max-Flow Algorithm

New Idea: use s-t paths in residual graph to augment flow



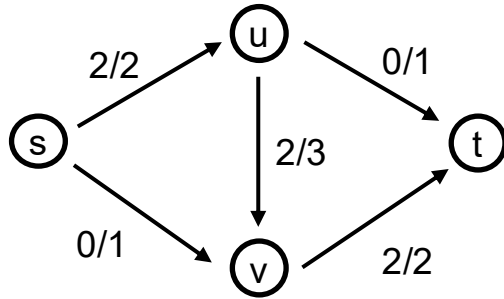
Current flow



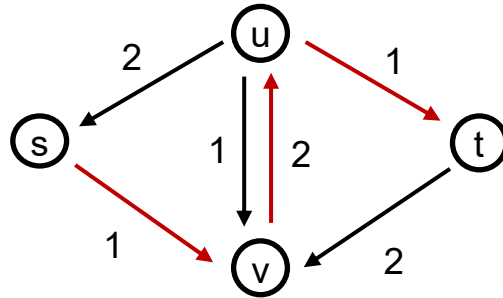
Residual graph

Max-Flow Algorithm

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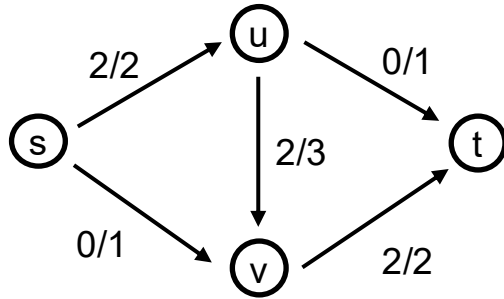
Current flow



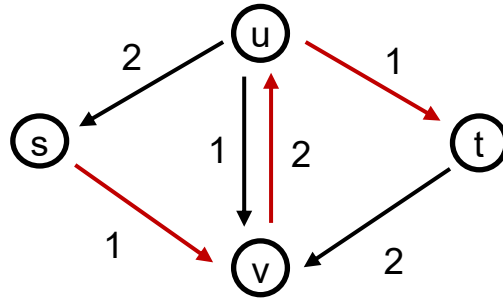
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Max-Flow Algorithm

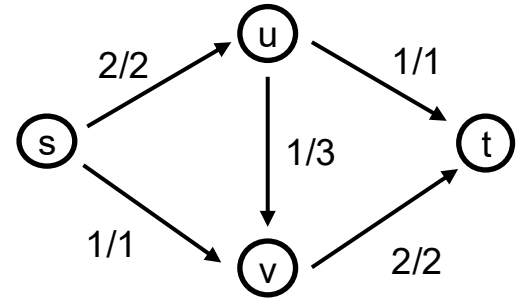
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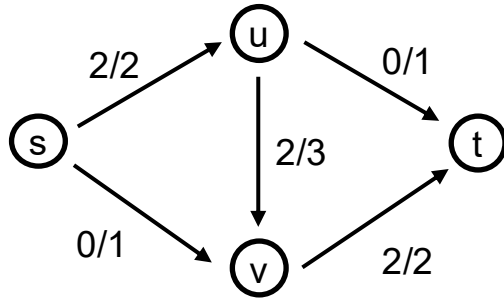
Residual graph



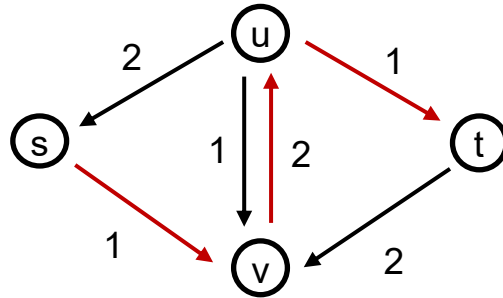
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Max-Flow Algorithm

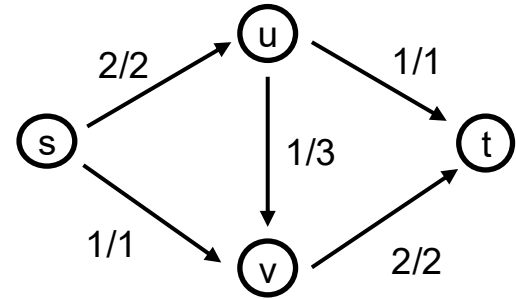
New Idea: use s-t paths in residual graph to augment flow



Current flow



Residual graph



New flow

Are we done?

Augment Function

New Idea: use s-t paths in residual graph to augment flow

- ❖ f is a flow in the graph
- ❖ P is an augmenting path (s-t path in G_f)

Augment(f, P)

$b \leftarrow \text{bottleneck}(P, f)$

least residual capacity in P

for each edge e in P **do**

if e is a forward edge **then**

$f(e) \leftarrow f(e) + b$

increase flow on forward edges

else e is a backward edge **do**

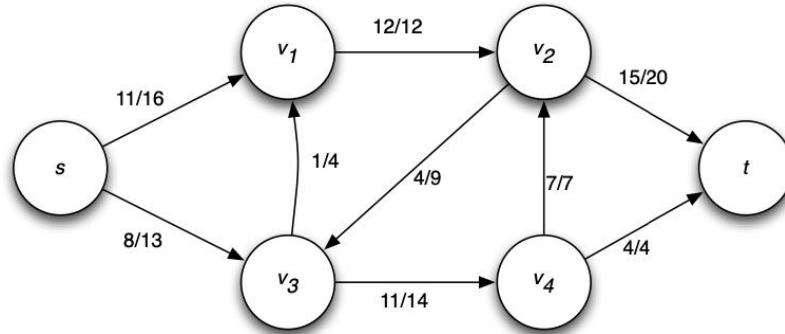
Let e' be opposite edge in G

$f(e') \leftarrow f(e') - b$

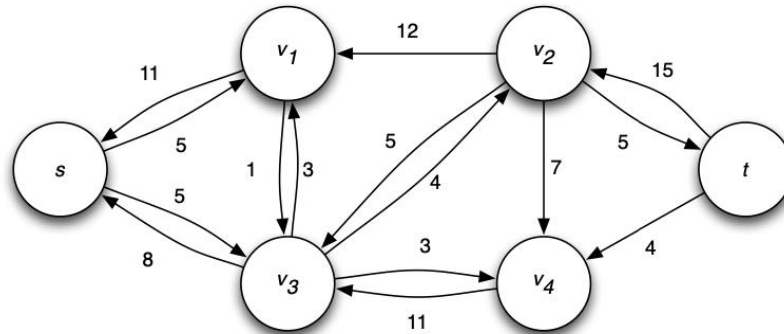
decrease flow on backward edges

Augmentation Example

G

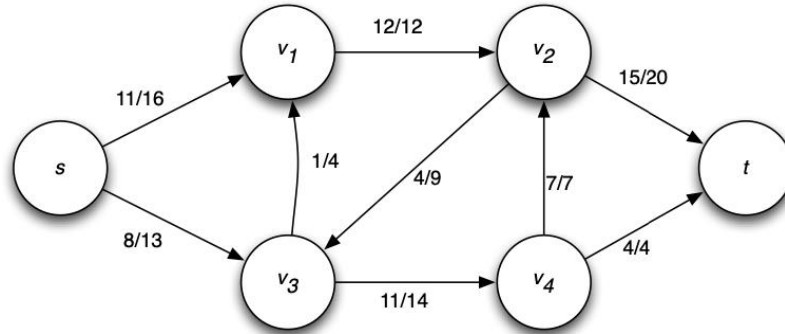


G_f

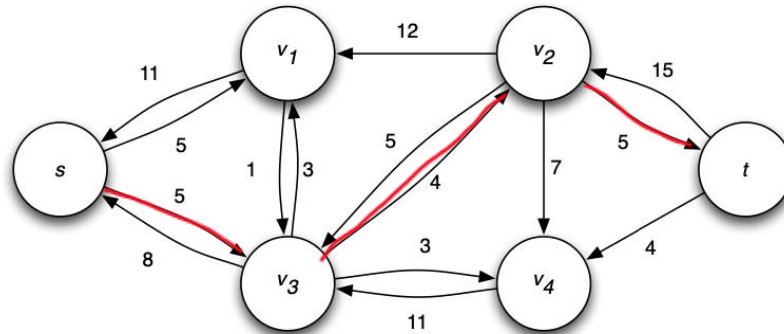


Augmentation Example

G

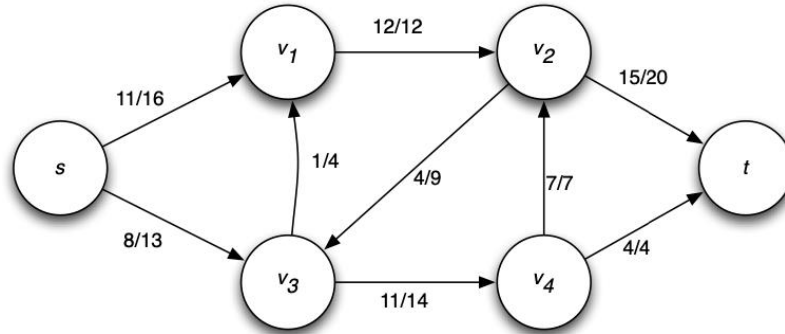


G_f

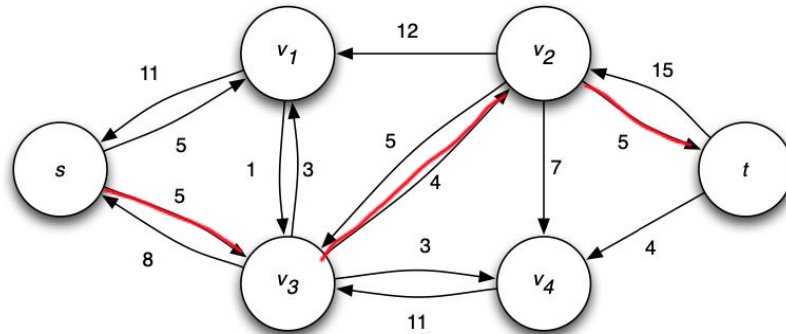


Augmentation Example

G

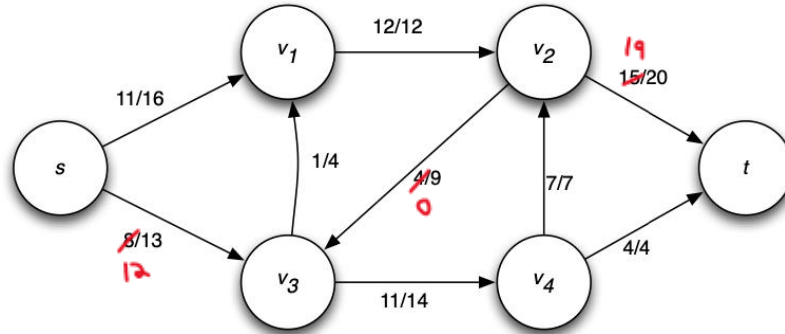


G_f

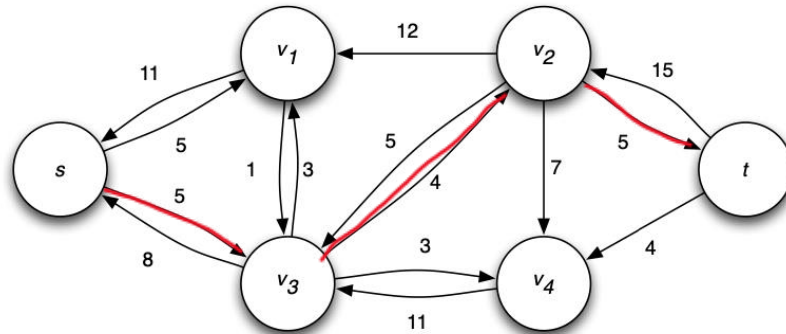


Augmentation Example

G



G_f



$b=4$

Ford-Fulkerson Algorithm

Repeatedly find augmenting paths in the residual graph and augment the flow!

Ford-Fulkerson(G, s, t)

Initialize $f(e) = 0$ for all edges e

initially, no flow

Initialize $G_f = G$

while there exists an s-t path P in G_f **do**

$f = \text{Augment}(f, P)$

Augment flow if it is possible

 update G_f

return f

Running Time Analysis

- ❖ Flow increases at least one unit per iteration of while loop
- ❖ Each while loop check at most m edges
- ❖ F-F terminates in at most C iterations
 - ❖ C is the sum of capacities leaving the source
- ❖ $C \leq n C_{max}$
 - ❖ C_{max} is the maximum edge capacity
- ❖ Running time: $O(mnC_{max})$

Running Time Analysis

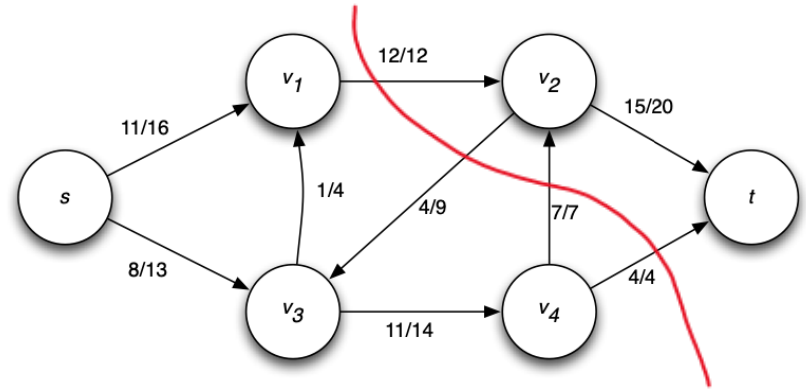
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Pseudo-polynomial in both m, n

Correctness Sketch

Consider a cut separating s , t

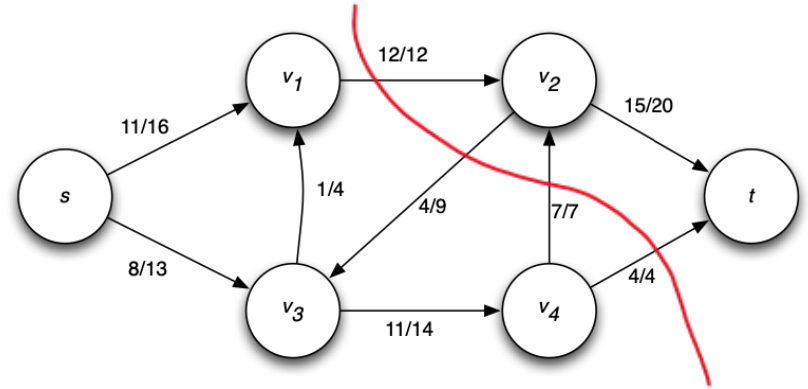
❖ What is a cut again?



Correctness Sketch

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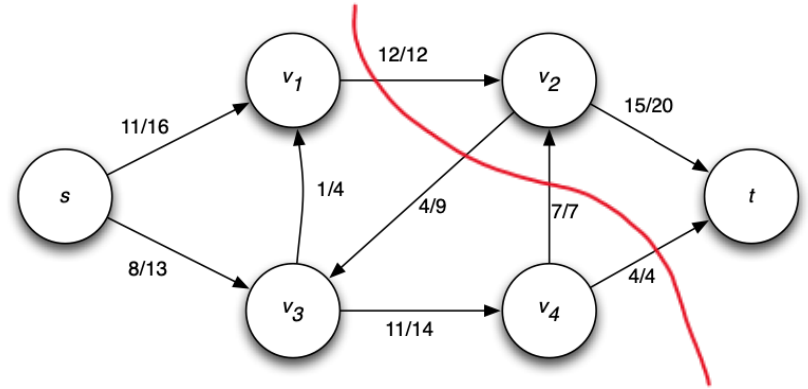
- ❖ What is a cut again?
- ❖ The **capacity** of a cut is the sum of all edges going from the source side to the target side



Correctness Sketch

Consider a cut separating s , t

- ❖ What is a cut again?
- ❖ The **capacity** of a cut is the sum of all edges going from the source side to the target side
- ❖ The total network flow can never exceed the capacity of the cut (true for every cut)



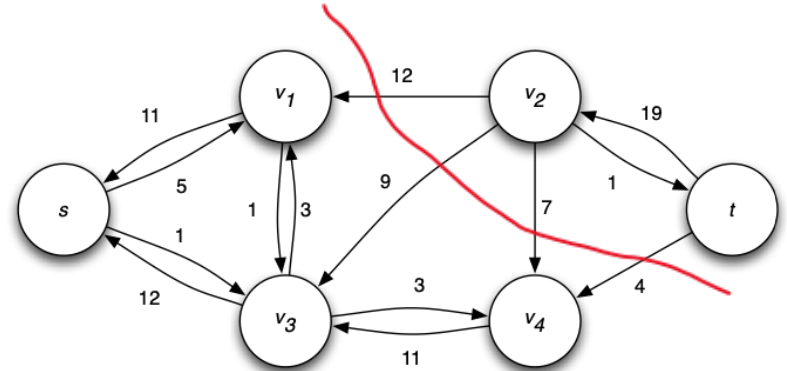
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When algo stops, we can no longer get from s to t in residual graph

- ❖ Group together reachable and unreachable vertices to form a cut



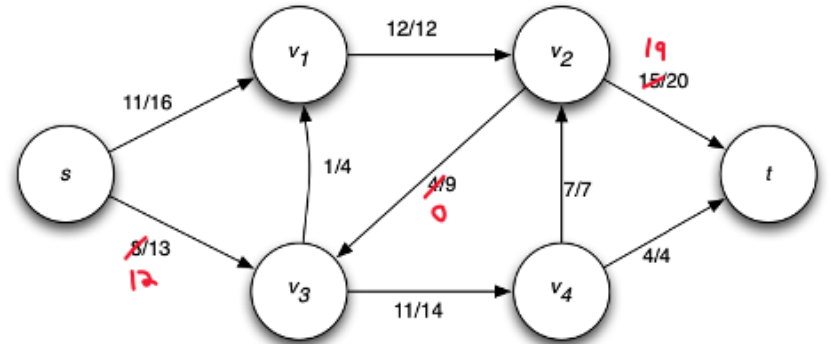
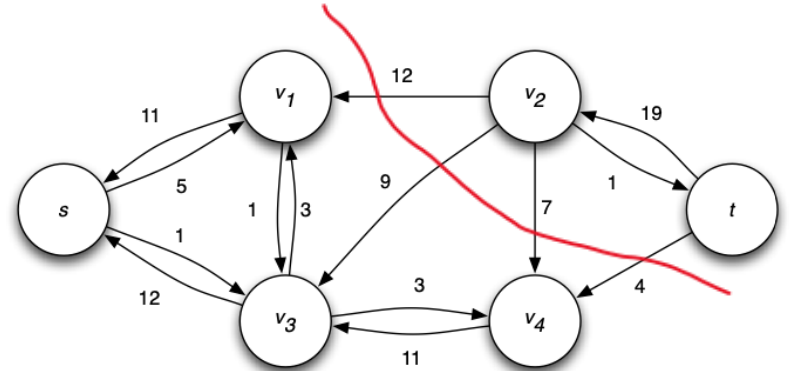
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When algo stops, we can no longer get from s to t in residual graph

- ❖ Group together reachable and unreachable vertices to form a cut
- ❖ Every cut edge must be at full capacity
- ❖ Therefore, this is a maximum flow



Next Time

- ❖ Applications of network flow