

Good Afternoon.

Advanced algorithms and data structures

Lecture 1: Max Flow 1

Jacob Holm (jaho@di.ku.dk)

November 20th 2023

Today's Lecture

Introduction

Max flow

- Definitions

- Ford-Fulkerson Method

- Max flow/Min cut Theorem

Summary

Introduction to AADS

This course is mostly about algorithms and how to analyse them.

We want *efficient* solutions when possible, where the meaning of “efficient” may depend on the problem.

In particular, we will focus on Polynomial time algorithms (fast) versus Exponential time algorithms (slow).

This weeks topic is a polynomial time algorithm. Later we will touch on some problems where we don't know or expect polynomial time algorithms to exist, and some ways to deal with that.

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Introduction to AADS

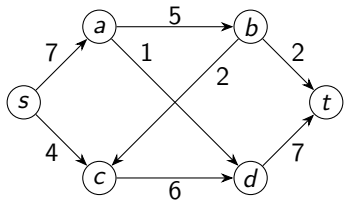
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Flow network



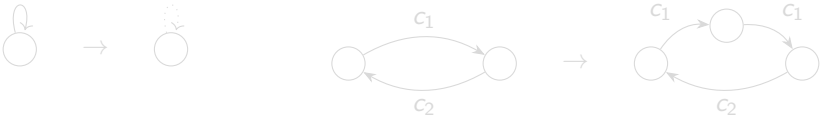
Example of a flow network.
Graph with nodes s and t . Send goods/data/water from s to t . Can not accumulate in intermediate nodes, so what goes in must come out (flow conservation).
Capacities, capacity constraint.
Max flow can be used by itself, or as black box for solving other problems.
No self-loops or antiparallel edges allowed by our algorithms/theorems. This is without loss of generality as we can always get rid of them.

Definition

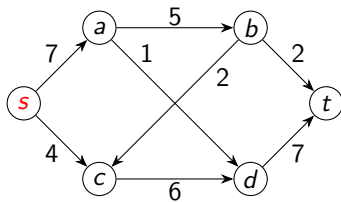
A *flow network* consists of a directed graph $G = (V, E)$, a source $s \in V$, a sink $t \in V \setminus \{s\}$, and a capacity function $c : V \times V \rightarrow \mathbb{R}$ such that

- ▶ $c(u, v) \geq 0$ for all $u, v \in V$, and
- ▶ if $(u, v) \notin E$ then $c(u, v) = 0$

We will assume that G has **no self-loops** and **no antiparallel edges**.



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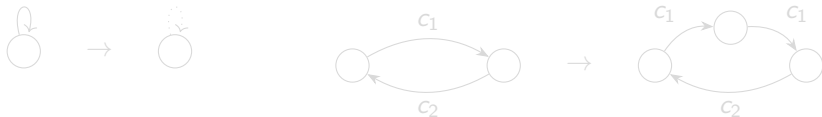


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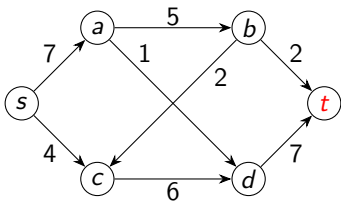
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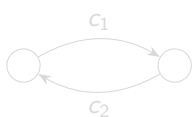


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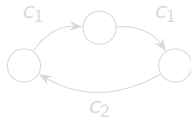
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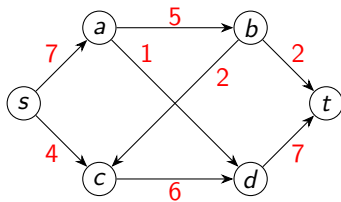
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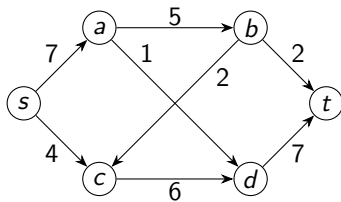
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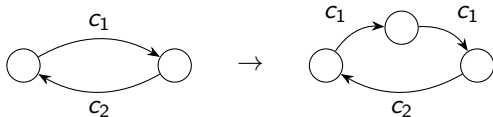
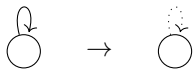


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Flow and max-Flow

Could also have defined as net flow entering t .

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Equivalently: $\sum_{(u,v) \in E} f(u, v) = \sum_{(v,w) \in E} f(v, w)$. Why?

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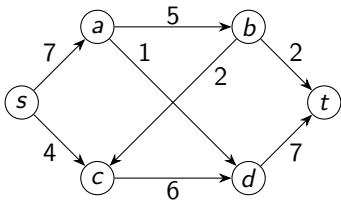
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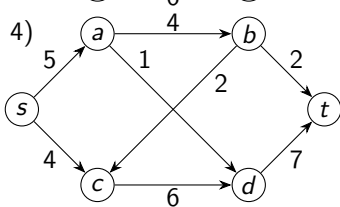
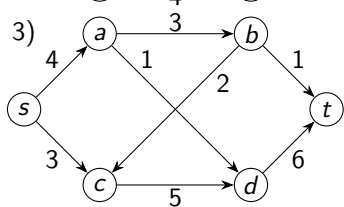
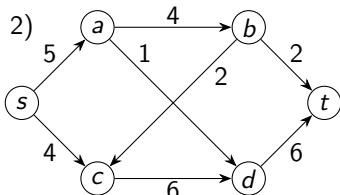
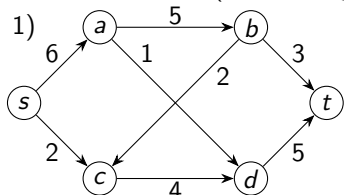
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Examples: Which of these are flows? What are the values?

Flow network
(capacities on edges)



Candidate flows (flow on edges)



Ex 1: No. Capacity violation at (b, t) .

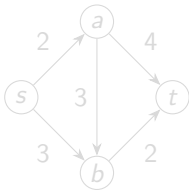
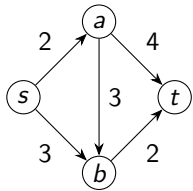
Ex 2: No. Flow conservation violation at d .

Ex 3: Yes. Value 7

Ex 4: Yes. Value 9. Actually a max flow.

Ford-Fulkerson Method (informal)

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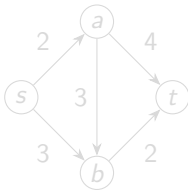
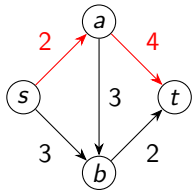


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Example 2: cancelling flow

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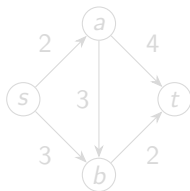
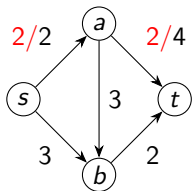


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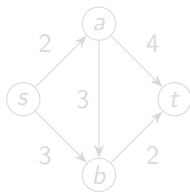
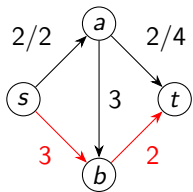


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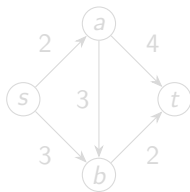
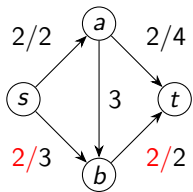


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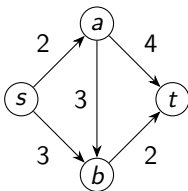
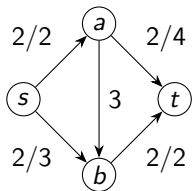


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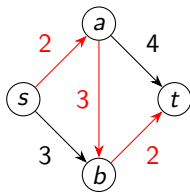
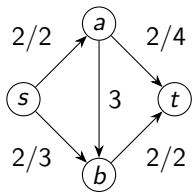


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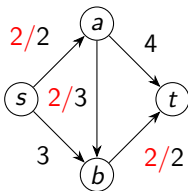
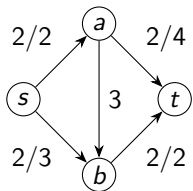


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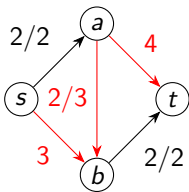
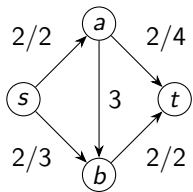


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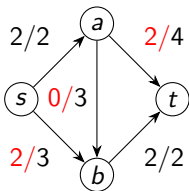
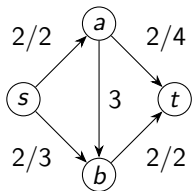


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Break

Residual network

Recall that G has no self-loops or anti-parallel edges.

Definition

Given a flow f in (G, s, t, c) , the **residual capacity** is the function

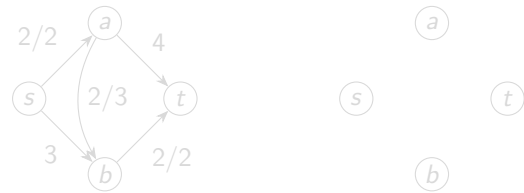
$c_f : V \times V \rightarrow \mathbb{R}$ defined by

$$c_f(u, v) := \begin{cases} c(u, v) - f(u, v) & \text{if } (u, v) \in E \text{ (i.e. how much more could be sent)} \\ f(v, u) & \text{if } (v, u) \in E \text{ (i.e. how much can be cancelled)} \\ 0 & \text{otherwise} \end{cases}$$

Definition

The **residual network** consist of the graph $G_f := (V, E_f)$ where $E_f = \{(u, v) \in V \times V \mid c_f(u, v) > 0\}$, together with s, t , and the capacity function c_f .

Note that (G_f, s, t, c_f) is a flow network (but may have antiparallel edges).



Example: What are the edges and residual capacities.

Residual network

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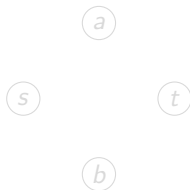
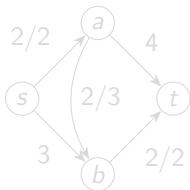
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Example: What are the edges and residual capacities.

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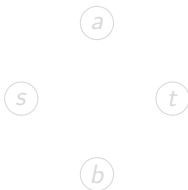
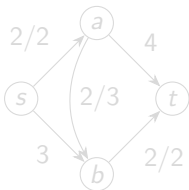
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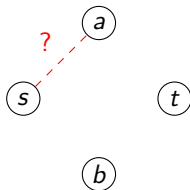
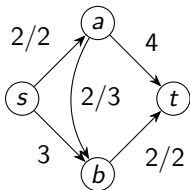
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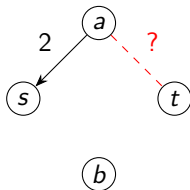
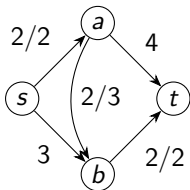
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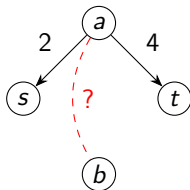
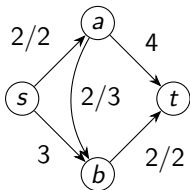
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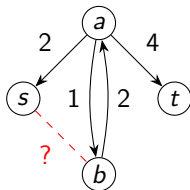
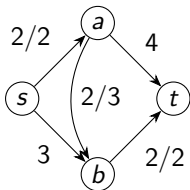
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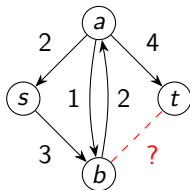
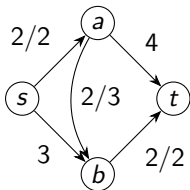
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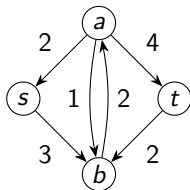
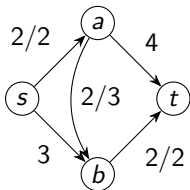
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function FORD-FULKERSON( $G = (V, E), s, t, c$ )  
   $f \leftarrow 0$   
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     $f \leftarrow f \uparrow f_p$   
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Illustrate “max flow along p ”.

$f \uparrow f'$ defined later.

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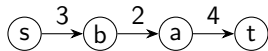
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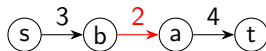
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Lemma

$f \uparrow f'$ is a flow in G of value $|f \uparrow f'| = |f| + |f'|$.

Proof.

Maybe later. Need to prove capacity constraints are satisfied and flow conservation holds. \square

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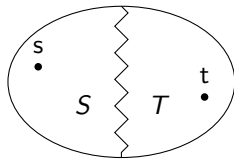
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A **cut** is a partition of V into subsets $S \ni s$ and $T \ni t$.



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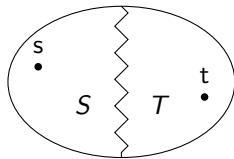
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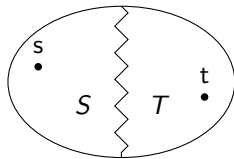
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Corollary (flow value upper bounded by cut capacity)

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For any flow f and any cut (S, T) , $|f| \leq c(S, T)$.

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$$\begin{aligned} |f| &= f(S, T) && \text{(By Lemma 2)} \\ &= \sum_{u \in S} \sum_{v \in T} (f(u, v) - f(v, u)) && \text{(By definition of } f(S, T)) \\ &\leq \sum_{u \in S} \sum_{v \in T} (c(u, v) - 0) && \left(\begin{array}{l} \text{Since } f(u, v) \leq c(u, v) \\ \text{and } -f(v, u) \leq 0 \text{ by the} \\ \text{capacity constraints} \end{array} \right) \\ &= c(S, T) && \square \end{aligned}$$

Illustrate on number line, all possible flow values are left of all possible cut capacities.

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Proof.

$$|f| = f(S, T) \quad (\text{By Lemma 2})$$

$$= \sum_{u \in S} \sum_{v \in T} (f(u, v) - f(v, u)) \quad (\text{By definition of } f(S, T))$$

$$\leq \sum_{u \in S} \sum_{v \in T} (c(u, v) - 0) \quad \left(\begin{array}{l} \text{Since } f(u, v) \leq c(u, v) \\ \text{and } -f(v, u) \leq 0 \text{ by the} \\ \text{capacity constraints} \end{array} \right)$$

$$= c(S, T) \quad \square$$

Illustrate on number line, all possible flow values are left of all possible cut capacities.

Max flow/Min cut Theorem says they meet in the middle.

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Max flow/Min cut Theorem

Theorem (Max flow/Min cut Theorem)

Let f be a flow in (G, s, t, c) . Then the following 3 statements are equivalent:

- 1. f is a max flow.*
- 2. There is no augmenting path (in G_f).*
- 3. There exists a cut (S, T) such that $|f| = c(S, T)$.*

Q: What does this say about Ford-Fulkerson?

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A: If it terminates, it returns the correct result.

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Today's topic was Max Flow. We have covered

- ▶ Definition of flow network, flow, etc
- ▶ The Ford-Fulkerson Method
- ▶ The Max flow/Min cut Theorem

Next time:

- ▶ Proof of Max flow/Min cut Theorem
- ▶ Worst case analysis of Ford-Fulkerson
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