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# Generalized Temporally Repeated Flows for the Quickest Transshipment and Related Problems

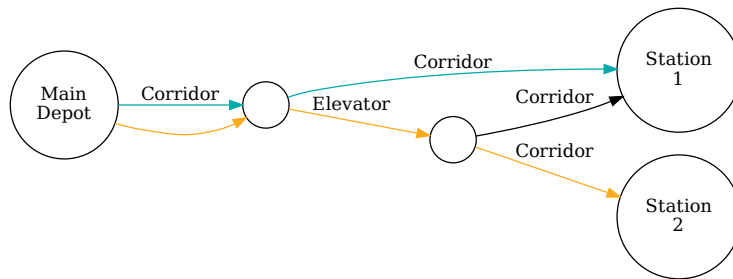
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Emma Ahrens

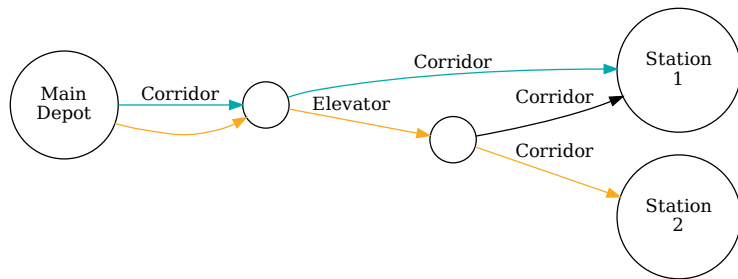
Supervised by Prof. Dr. Christina Büsing

~~July 18, 2025~~

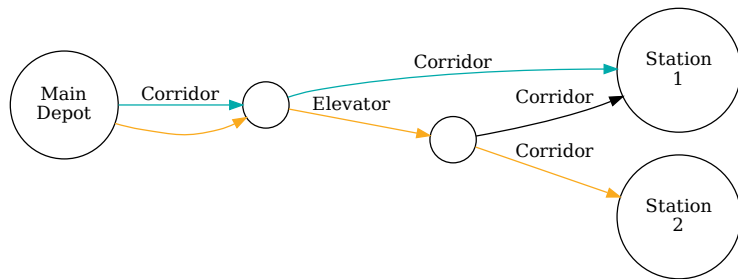
**October 28, 2022**



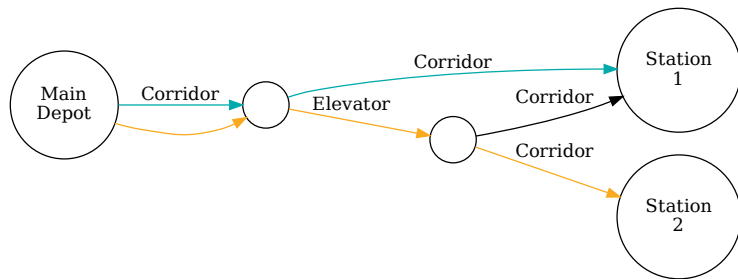
- Transportation of hospital beds during the day blocks elevators for time-critical processes



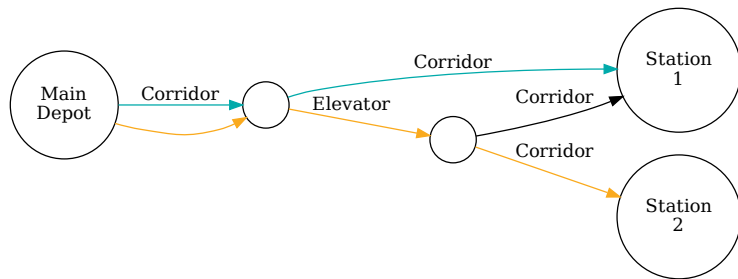
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- ⇒ Distribution after the main working hours? What would be important?
- As quick as possible to relieve the employees
  - As easy to remember as possible to reduce confusion
  - As few employees involved as possible

## 1. Theory of Flows

Network Flow Problems & Integrality

## 2. Tree Networks

Almost-binary Trees

Quickest Transshipment on Trees

Load-Consistent Flows

## 3. Cost Minimization at each Point in Time

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## 3. Cost Minimization at each Point in Time



## Definition

For

- a directed graph  $G = (V, A)$ ,
- a *capacity* function  $u : A \rightarrow \mathbb{N}_0$ ,
- a *transit time* function  $\tau : A \rightarrow \mathbb{N}_0$ , and
- a *cost* function  $c : A \rightarrow \mathbb{N}_0$ ,

$(G, u)$ ,  $(G, u, c)$ ,  $(G, u, \tau)$  and  $(G, u, \tau, c)$  are *networks*.

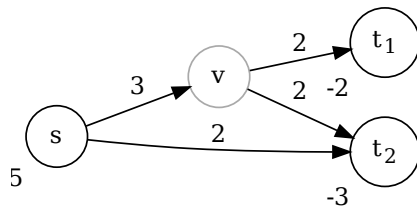


Figure: Network with labels  $u$  and  $b$ .

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## Definition

A function  $b : V \rightarrow \mathbb{Z}$  with  $\sum_{v \in V} b(v) = 0$  is a *balance* function.

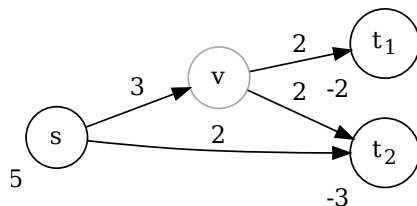


Figure: Network with labels  $u$  and  $b$ .

## Definition

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a *static  $b$ -flow* is a function  $x : A \rightarrow \mathbb{R}_{\geq 0}$ , which satisfies

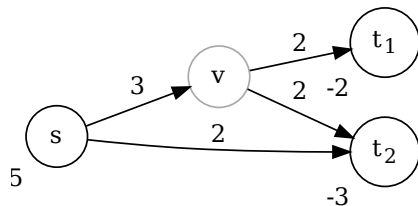


Figure: Network with labels  $u$  and  $b$ .

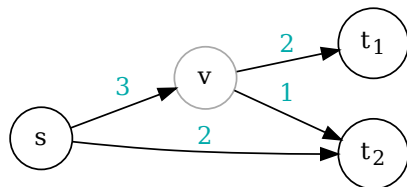


Figure: Flow represented by labels  $x$  on arcs.

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1. the *capacity constraint*  $0 \leq x(a) \leq u(a)$  for all  $a \in A$ , and

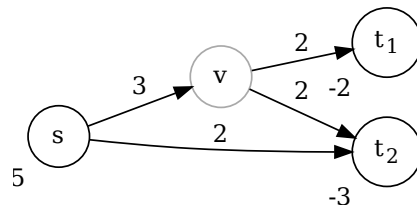


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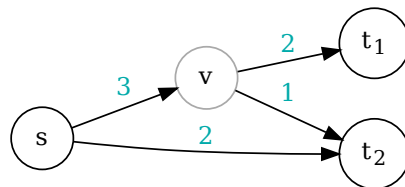


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2. the *flow conservation*

$$\sum_{a \in \delta^-(v)} x(a) - \sum_{a \in \delta^+(v)} x(a) = -b(v)$$

for all  $v \in V$ .

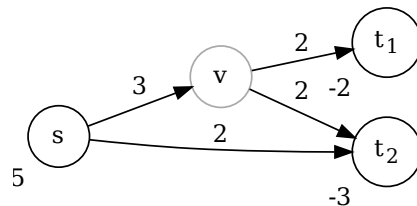


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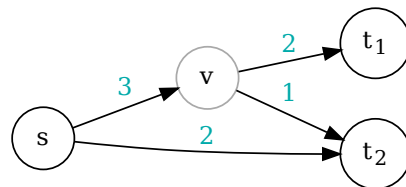


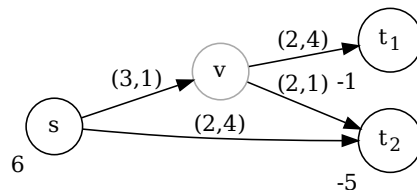
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## Definition

For

- a network  $(G, u, \tau)$ ,
- a time horizon  $T \in \mathbb{N}_0$ , and
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a *b-flow over time* is a family of functions  $f_a : \mathbb{Z} \rightarrow \mathbb{R}_{\geq 0}$ ,  $a \in A$ , which satisfy



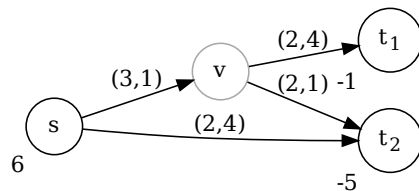
**Figure:** Network with labels representing  $(u, \tau)$  and  $b$ .

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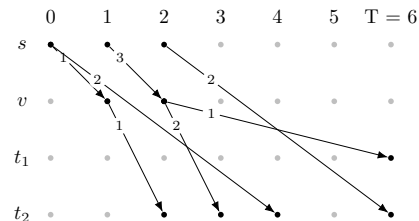
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**Figure:** Labels represent load on arcs.

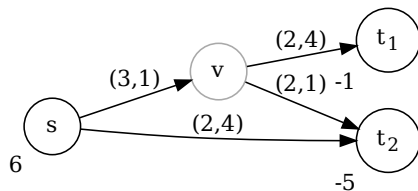
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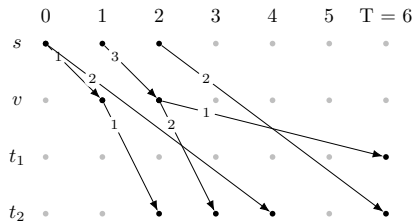
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1. the *capacity constraint*  $0 \leq f_a(\theta) \leq u(a)$  for all  $a \in A$  and  $\theta \in \{0, \dots, T\}$ ,



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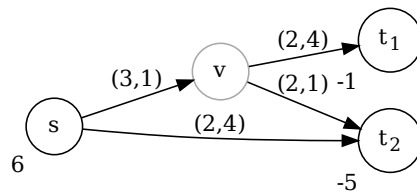
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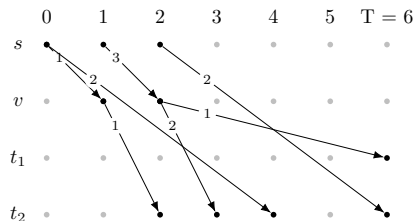
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2. the *flow completion*  $f_a(\theta) = 0$  for all  $a \in A$  and  $\theta > T - \tau_a$ ,



**Figure:** Network with labels representing  $(u, \tau)$  and  $b$ .



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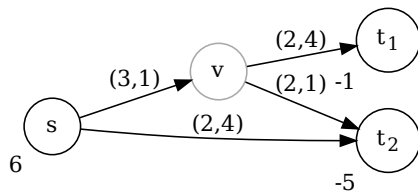
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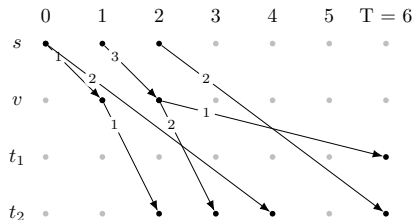
a *b-flow over time* is a family of functions  $f_a : \mathbb{Z} \rightarrow \mathbb{R}_{\geq 0}$ ,  $a \in A$ , which satisfy

3. the *weak flow conservation* for all  $v \in V \setminus \{s\}$  and  $\theta \in \{0, \dots, T\}$

$$\sum_{a \in \delta^-(v)} \sum_{\xi=0}^{\theta - \tau_a} f_a(\xi) - \sum_{a \in \delta^+(v)} \sum_{\xi=0}^{\theta} f_a(\xi) \geq 0,$$



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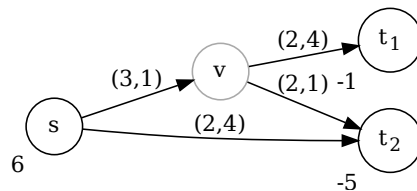
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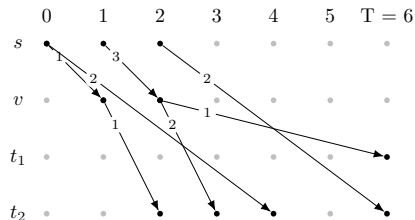
a *b-flow over time* is a family of functions  $f_a : \mathbb{Z} \rightarrow \mathbb{R}_{\geq 0}$ ,  $a \in A$ , which satisfy

- the *strict flow conservation* for all  $v \in V$

$$\sum_{a \in \delta^-(v)} \sum_{\xi=0}^{T-\tau_a} f_a(\xi) - \sum_{a \in \delta^+(v)} \sum_{\xi=0}^T f_a(\xi) = -b(v),$$



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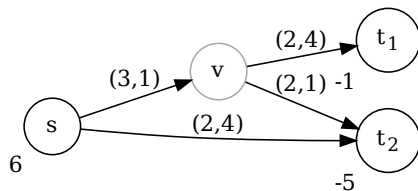
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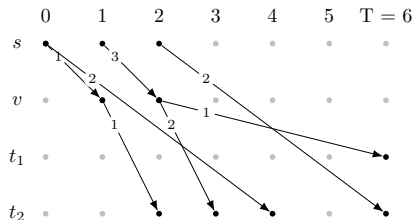
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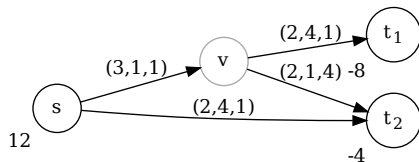
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For

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- a static flow  $x$  over  $(G, u)$  with path decomposition  $y : P \rightarrow \mathbb{R}_{\geq 0}$  and  $t := \max_{p \in P} \tau(p)$ ,

the associated *uniform flow*  $f$  is



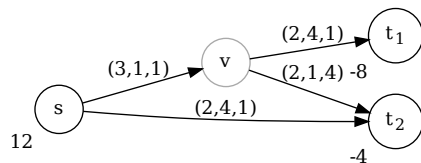
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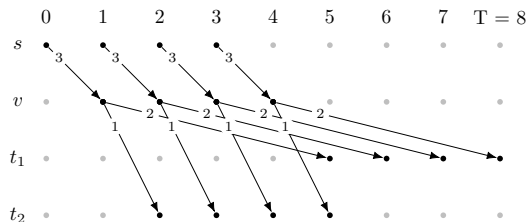
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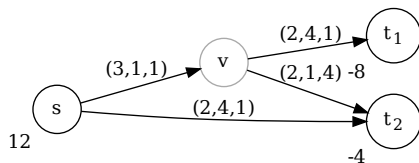
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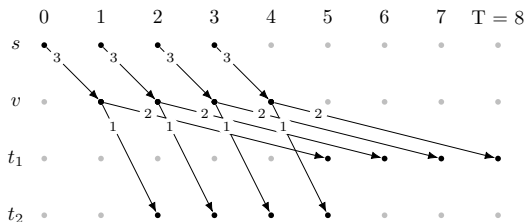
$$f_a(\theta) := \sum_{p \in P_a(\theta)} y(p) \quad \forall a \in A, \theta \in \{0, \dots, T\},$$

where

$P_a(\theta) := \{p \in P \mid a \in p, 0 \leq \theta - \tau(p_{[s,v]}) \leq T - t\}$   
for  $a = (v, w)$  and  $p = (s, \dots, t_i)$ ,  
and  $f_a(\theta) := 0$  for  $\theta \notin \{0, \dots, T\}$ .



**Figure:** Network with labels representing  $(u, \tau, c)$  and  $b$ .



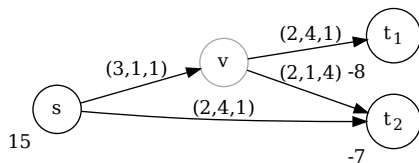
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the assoc. *temporally repeated flow*  $f$  is



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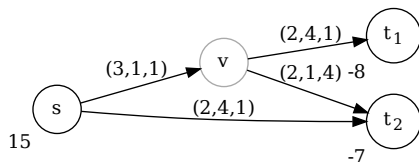


## Definition

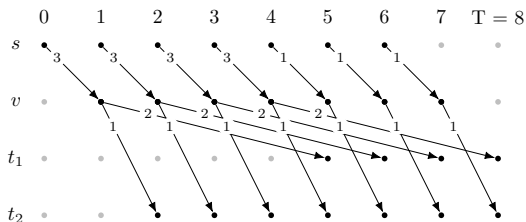
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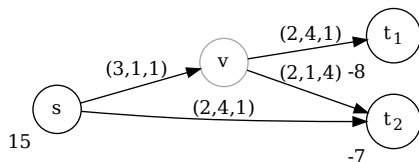
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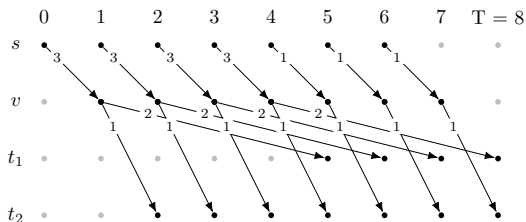
the assoc. *temporally repeated flow*  $f$  is

$$f_a(\theta) := \sum_{p \in P_a(\theta)} y(p) \quad \forall a \in A, \theta \in \{0, \dots, T\},$$

where  $P_a(\theta) := \{p \in P \mid a \in p, \tau(p_{[s,v]}) \leq \theta, \tau(p_{[w,t]}) \leq T - \theta\}$   
for  $a = (v, w)$  and  $p = (s, \dots, t_i)$ ,  
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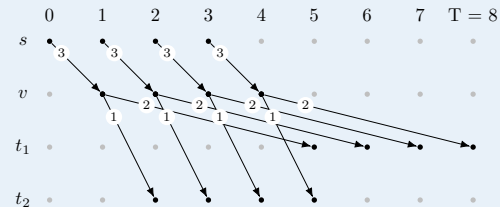


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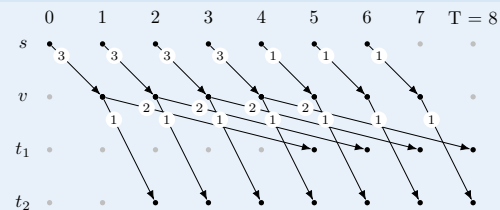


**Figure:** Labels represent load on arcs.

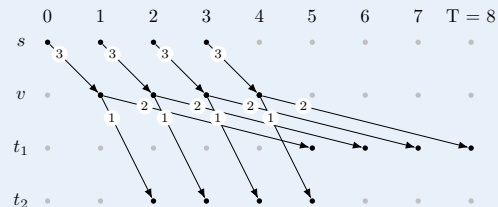
## Uniform Flow



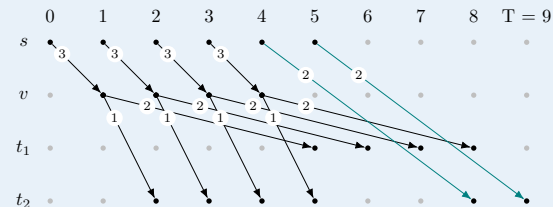
## Temporally Repeated Flow



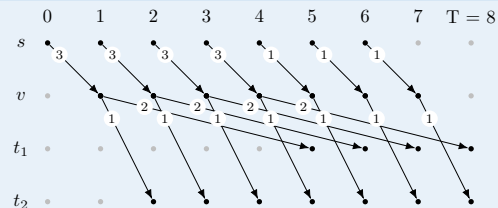
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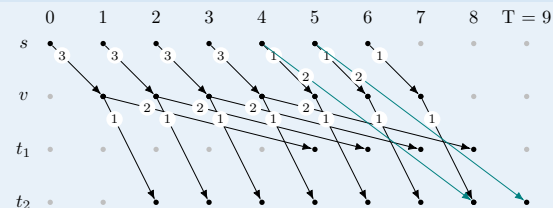
## $k$ -Uniform Flow for $k = 2$



## Temporally Repeated Flow



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- Max Flow Problem

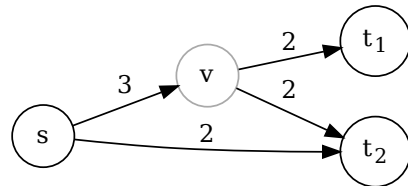
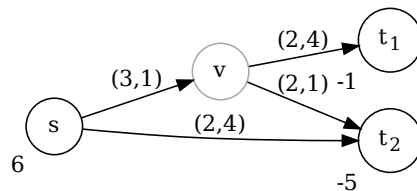


Figure: Network with labels representing  $u$ .

- Max Flow Problem
- Min Cost Flow Problem



**Figure:** Network with labels representing  $(u, c)$  and  $b$ .

- Max Flow Problem
- Min Cost Flow Problem
- Max Flow over Time Problem

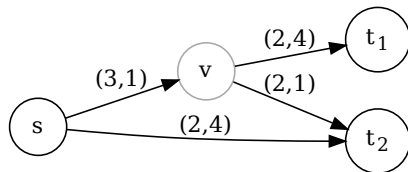
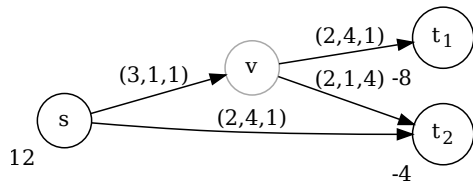


Figure: Network with labels representing  $(u, \tau)$ .

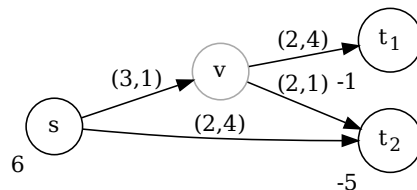
- Max Flow Problem
- Min Cost Flow Problem
- Max Flow over Time Problem
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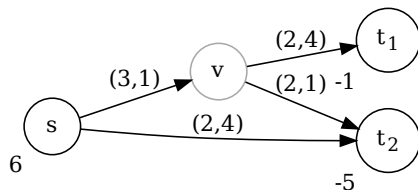


- Max Flow Problem
- Min Cost Flow Problem
- Max Flow over Time Problem
- Min Cost Flow over Time Problem
- Earliest Arrival Flow over Time Problem



**Figure:** Network with labels representing  $(u, \tau)$  and  $b$ .

- Max Flow Problem
- Min Cost Flow Problem
- Max Flow over Time Problem
- Min Cost Flow over Time Problem
- Earliest Arrival Flow over Time Problem
- Quickest Transshipment Problem



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- Max Flow Problem
- Min Cost Flow Problem
- Max Flow over Time Problem
- Min Cost Flow over Time Problem
- Earliest Arrival Flow over Time Problem
- Quickest Transshipment Problem
- Min Cost Uniform Flow Problem

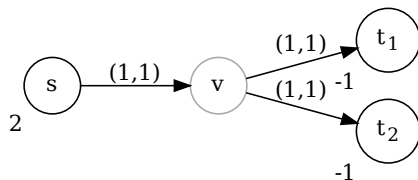


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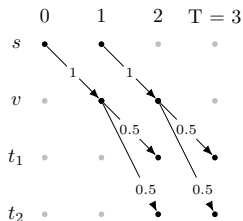
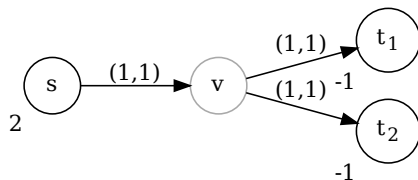
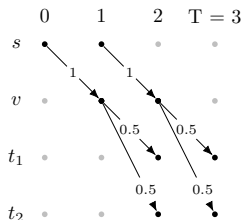


Figure: Labels represent loads on arcs.

- Max Flow Problem
- Min Cost Flow Problem
- Max Flow over Time Problem
- Min Cost Flow over Time Problem
- Earliest Arrival Flow over Time Problem
- Quickest Transshipment Problem
- Min Cost Uniform Flow Problem
- Quickest Transshipment Problem for Uniform Flows



**Figure:** Network with labels representing  $(u, \tau)$  and  $b$ .



**Figure:** Labels represent loads on arcs.

## 1. Theory of Flows

Network Flow Problems & Integrality

## 2. Tree Networks

Almost-binary Trees

Quickest Transshipment on Trees

Load-Consistent Flows

## 3. Cost Minimization at each Point in Time

## Definition

$G$  is a tree, then  $(G, u, \tau, c)$  is a *tree network*.

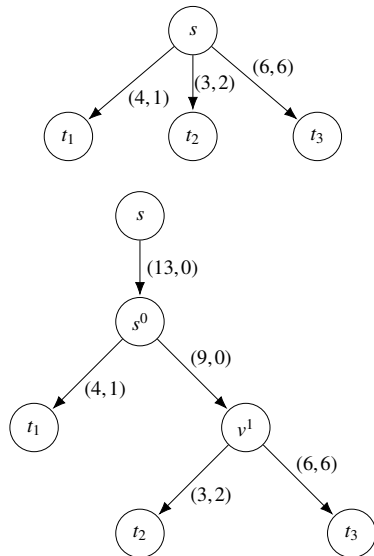


Figure: Networks with labels representing  $(u, \tau)$ .

## Definition

$G$  is a tree, then  $(G, u, \tau, c)$  is a *tree network*.

## Definition

Flow  $f$  on  $(G, u, \tau, c)$  and  $f'$  on  $(G', u', \tau', c')$ . Then  $f \equiv f'$  if

- the number of sinks is equal,
- for each sink at each point in time the same number of units arrives with the same aggregated costs.

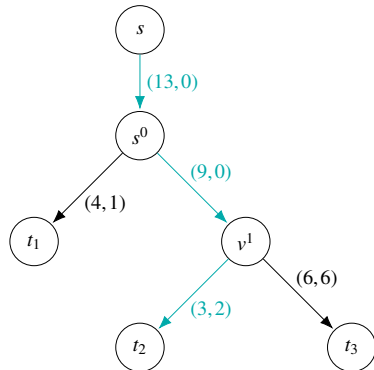
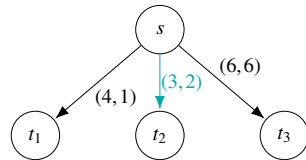


Figure: Networks with labels representing  $(u, \tau)$ .

## Definition

Two tree networks  $(G, u, \tau, c)$ ,  $(G', u', \tau', c')$  are *equivalent*,

$$(G, u, \tau, c) \equiv (G', u', \tau', c'),$$

if for each flow  $f$  on  $(G, u, \tau, c)$  there exists an equivalent flow  $f'$  on the other network  $(G', u', \tau', c')$  and vice versa.

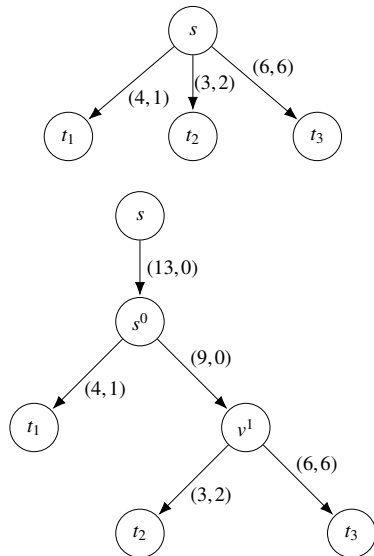


Figure: Networks with labels representing  $(u, \tau)$ .



## Definition

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if for each flow  $f$  on  $(G, u, \tau, c)$  there exists an equivalent flow  $f'$  on the other network  $(G', u', \tau', c')$  and vice versa.

⇒ For all mentioned network problems:  
Given two equivalent networks, all optimal solutions have the *same objective value*.  
The optimal solutions have equivalent counterparts.

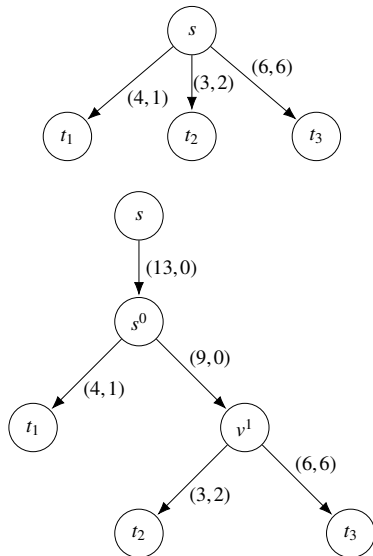


Figure: Networks with labels representing  $(u, \tau)$ .

## Definition

Tree network  $(G, u, \tau, c)$  and node  $v \in V$ . We define operation  $\rho_1((G, u, \tau, c), v)$ : It maps to  $(G, u, \tau, c)$  if  $v$  is

- a leaf,
- has at least two children, or
- is the root.

Otherwise, it maps to  $(G', u', \tau', c')$  which resembles the network  $(G, u, \tau, c)$  with the changes in the picture.

## Lemma

For tree network  $(G, u, \tau, c)$  and any node  $v \in V$ , it is  $\rho_1((G, u, \tau, c), v) \equiv (G, u, \tau, c)$ .

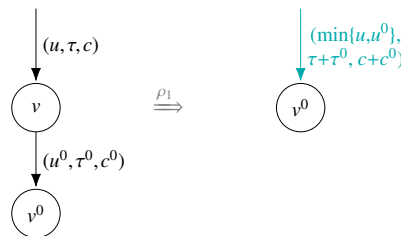


Figure: The operation  $\rho_1$ .

## Definition

Tree network  $(G, u, \tau, c)$  and node  $v \in V$ . We define operation  $\rho_2((G, u, \tau, c), v)$ : It maps to  $(G, u, \tau, c)$  if  $v$  has

- at most two children.

Otherwise, it maps to  $(G', u', \tau', c')$  which resembles the network  $(G, u, \tau, c)$  with the changes in the picture.

## Lemma

For tree network  $(G, u, \tau, c)$  and any node  $v \in V$ , it is  $\rho_2((G, u, \tau, c), v) \equiv (G, u, \tau, c)$ .

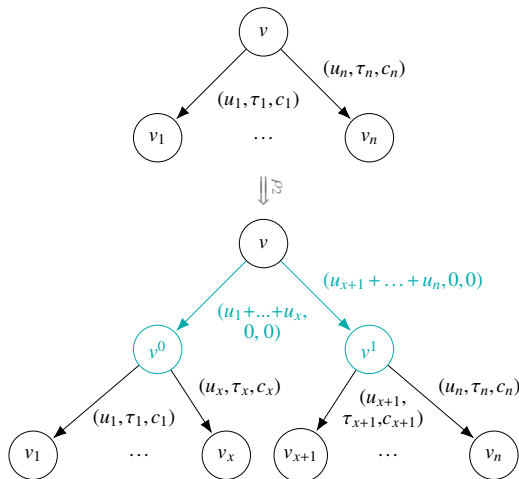


Figure: The operation  $\rho_2$ .

## Definition

Tree network  $(G, u, \tau, c)$  and node  $v \in V$ . We define operation  $\rho_3((G, u, \tau, c), v)$ : It maps to  $(G, u, \tau, c)$  if  $v$  has

- at most one child.

Otherwise, it maps to  $(G', u', \tau', c')$  which resembles the network  $(G, u, \tau, c)$  with the changes in the picture.

## Lemma

For tree network  $(G, u, \tau, c)$  and any node  $v \in V$ , it is  $\rho_3((G, u, \tau, c), v) \equiv (G, u, \tau, c)$ .

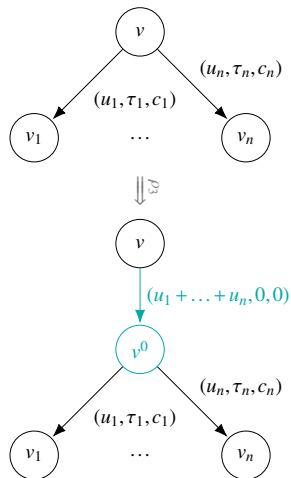


Figure: The operation  $\rho_3$ .

## Definition

An *almost-binary tree* is a tree  $G$  with

- the root node  $r \in V$  has at most one child  $v \in V$ , and
- the subtree of  $v$  is a complete binary tree (if  $v$  exists).

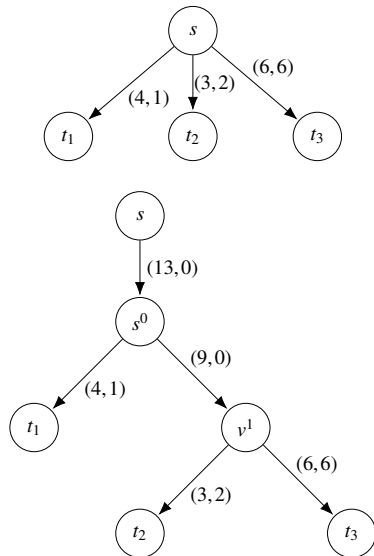


Figure: Networks with labels representing  $(u, \tau)$ .

## Definition

An *almost-binary tree* is a tree  $G$  with

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## Theorem

For each tree network  $(G, u, \tau, c)$ , there exists an equivalent tree network where the underlying graph is an almost-binary tree.

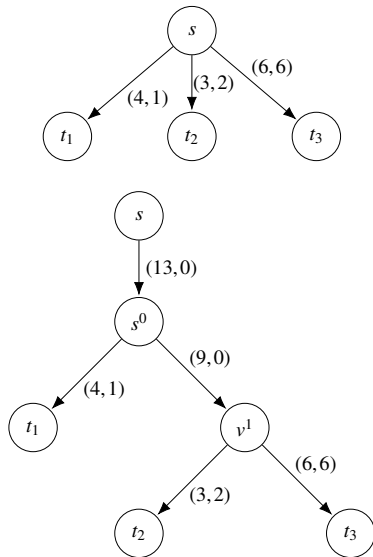


Figure: Networks with labels representing  $(u, \tau)$ .

## Theorem

For each tree network  $(G, u, \tau, c)$ , there exists an equivalent tree network where the underlying graph is an almost-binary tree.

## Theorem

Let  $(G, u, \tau, c)$  be tree network, where  $G$  has degree  $k \in \mathbb{N}_0$  and  $|G| = n$ . Then, an equivalent binary tree network can be computed in  $O(n \cdot k)$  steps.

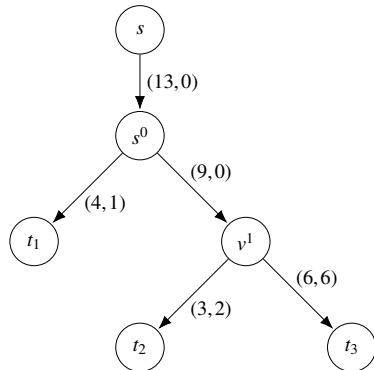
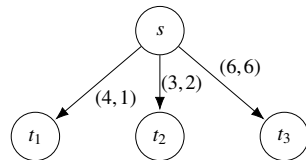
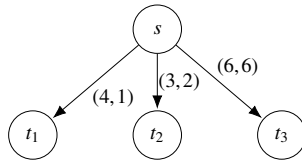
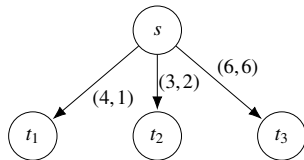


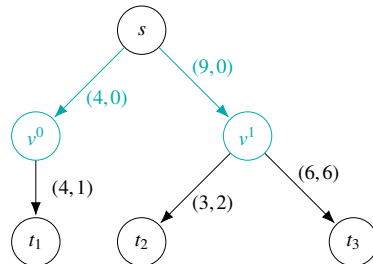
Figure: Networks with labels representing  $(u, \tau)$ .

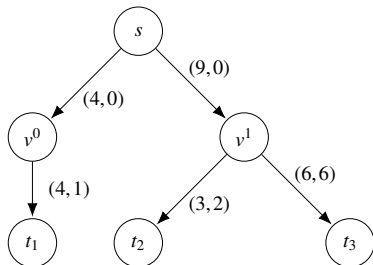


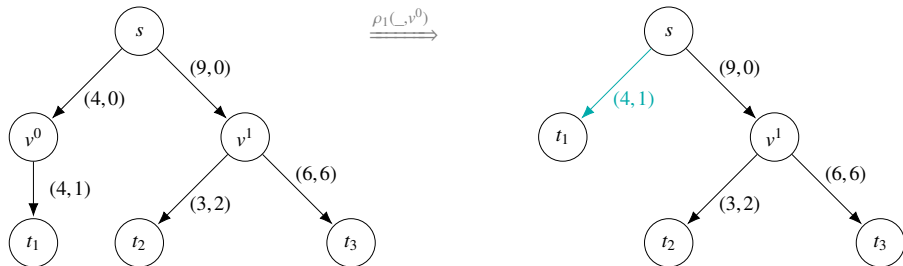


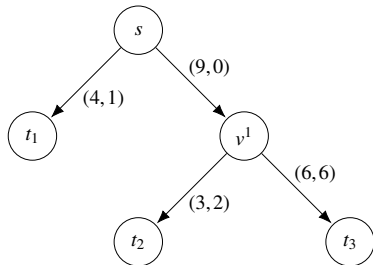


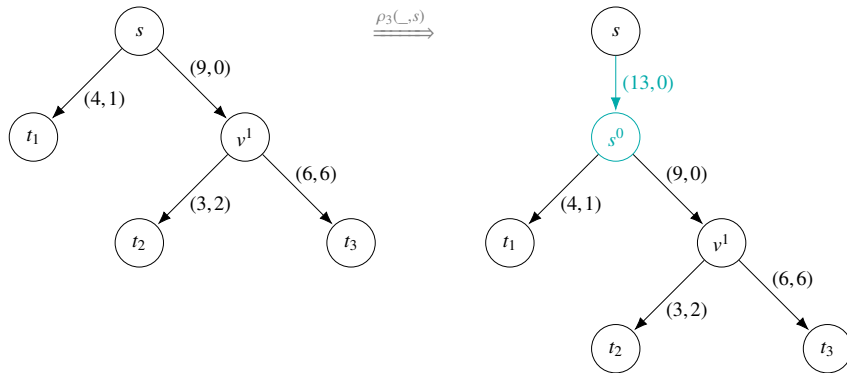
$\rho_2(\_, s) \Rightarrow$

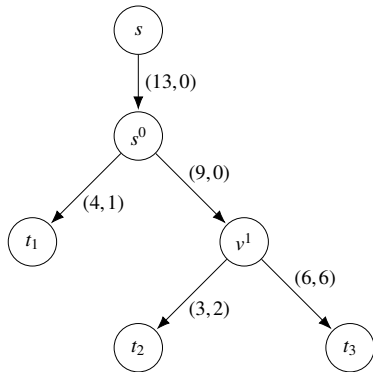


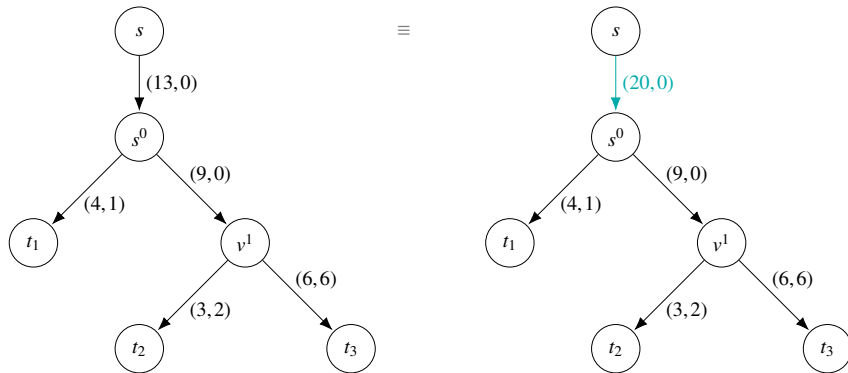












## Definition

Given a tree network  $(G, u, \tau)$ , and a balance function  $b$ , find an *integer  $k$ -uniform flow* with arbitrary  $k \leq h$  which

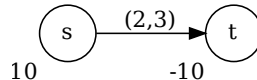
- satisfies the balances and
- has minimal overall time horizon  $T \in \mathbb{N}$ .



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**Figure:** Network with labels representing  $(u, \tau)$  and  $b$ .

## Definition

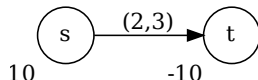
Given a tree network  $(G, u, \tau)$ , and a balance function  $b$ , find an *integer*  $k$ -uniform flow with arbitrary  $k \leq h$  which

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- has minimal overall time horizon.

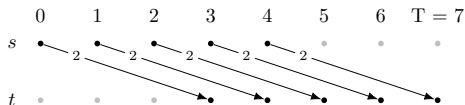
## Lemma

For an almost-binary tree network  $(G, u, \tau, c)$  with one leaf and balance function  $b$ . Then, the minimal time horizon for a 1-uniform flow satisfying  $b$  is

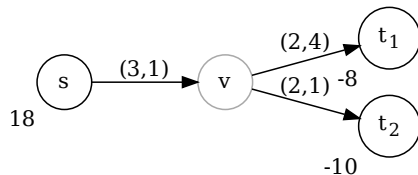
$$T := \left\lceil \frac{b}{u} \right\rceil + \tau - 1.$$



**Figure:** Network with labels representing  $(u, \tau)$  and  $b$ .



**Figure:** Labels represent loads on arcs.



**Figure:** Network with labels representing  $(u, \tau)$  and  $b$ .

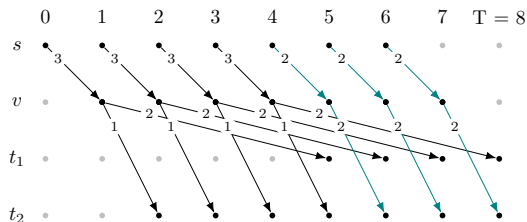


Figure: Labels represent loads on arcs.

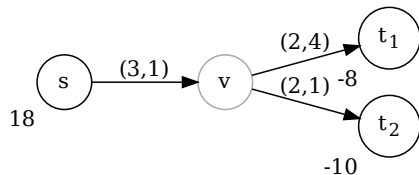
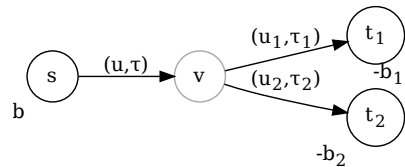


Figure: Network with labels representing  $(u, \tau)$  and  $b$ .



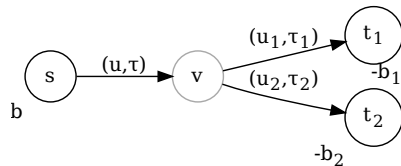
**Figure:** Network with labels representing  $(u, \tau)$  and  $b$ .

## Lemma

We set  $\mathbf{u}_i := \min\{u, u_i\}$ ,  $\tau_i := \tau + \tau_i$ .

The quickest 1- or 2-uniform flow has time horizon

$$\begin{aligned}
 T := \min( & \{ f(\mathbf{u}_1, \tau_1, b_1, \mathbf{u}_2, \tau_2, b_2) \} \\
 & \cup \{ g(\mathbf{u}_1, \tau_1, b_1, \mathbf{u}_2, \tau_2, b_2, x_1, x_2) \mid \\
 & \quad 1 \leq x_1 \leq \mathbf{u}_1, 1 \leq x_2 \leq \mathbf{u}_2, x_1 + x_2 \leq u \} \\
 & \cup \{ h(\tau_1, b_1, \tau_2, b_2, x_1, x_2, y_1, y_2, d) \mid \\
 & \quad 1 \leq x_1 \leq \mathbf{u}_1, 1 \leq y_1 \leq \mathbf{u}_1, 1 \leq x_2 \leq \mathbf{u}_2, \\
 & \quad 1 \leq y_2 \leq \mathbf{u}_2, x_1 + x_2 \leq u, y_1 + y_2 \leq u, \\
 & \quad d < \min \left\{ \left\lceil \frac{b_1}{x_1} \right\rceil, \left\lceil \frac{b_2}{x_2} \right\rceil \right\}, \left\lceil \frac{b_1 - d \cdot x_1}{y_1} \right\rceil = \left\lceil \frac{b_2 - d \cdot x_2}{y_2} \right\rceil \} ).
 \end{aligned}$$



**Figure:** Network with labels representing  $(u, \tau)$  and  $b$ .

## Lemma

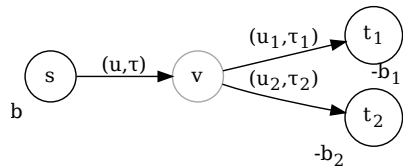
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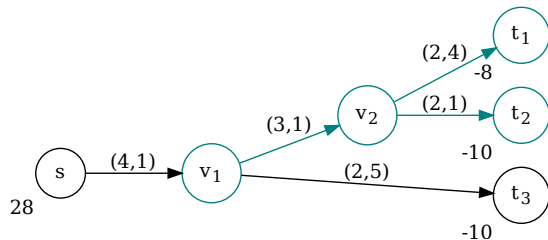
$$T := \min( \{ f(\mathbf{u}_1, \tau_1, b_1, \mathbf{u}_2, \tau_2, b_2) \} \\ \cup \{ g(\mathbf{u}_1, \tau_1, b_1, \mathbf{u}_2, \tau_2, b_2, x_1, x_2) \mid \\ 1 \leq x_1 \leq \mathbf{u}_1, 1 \leq x_2 \leq \mathbf{u}_2, x_1 + x_2 \leq u \} \\ \cup \{ h(\tau_1, b_1, \tau_2, b_2, x_1, x_2, y_1, y_2, d) \mid \\ 1 \leq x_1 \leq \mathbf{u}_1, 1 \leq y_1 \leq \mathbf{u}_1, 1 \leq x_2 \leq \mathbf{u}_2, \\ 1 \leq y_2 \leq \mathbf{u}_2, x_1 + x_2 \leq u, y_1 + y_2 \leq u, \\ d < \min \left\{ \left\lceil \frac{b_1}{x_1} \right\rceil, \left\lceil \frac{b_2}{x_2} \right\rceil \right\}, \left\lceil \frac{b_1 - d \cdot x_1}{y_1} \right\rceil = \left\lceil \frac{b_2 - d \cdot x_2}{y_2} \right\rceil \} ).$$

It is  $f : \mathbb{N}_0^6 \rightarrow \mathbb{N}_0, (\mathbf{u}_1, \tau_1, b_1, \mathbf{u}_2, \tau_2, b_2) \mapsto$   

$$\begin{cases} \left\lceil \frac{b_1}{\mathbf{u}_1} \right\rceil + \left\lceil \frac{b_2}{\mathbf{u}_2} \right\rceil + \max \left\{ \tau_2, \tau_1 - \left\lceil \frac{b_2}{\mathbf{u}_2} \right\rceil \right\} - 1, & \tau_1 \geq \tau_2, \\ f(\mathbf{u}_2, \tau_2, b_2, \mathbf{u}_1, \tau_1, b_1), & \text{otherwise.} \end{cases}$$



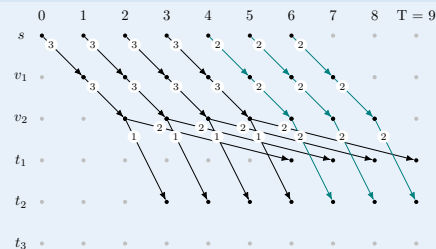
**Figure:** Network with labels representing  $(u, \tau)$  and  $b$ .



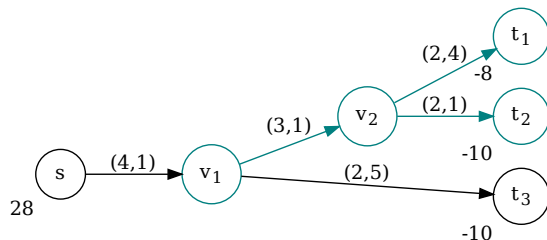
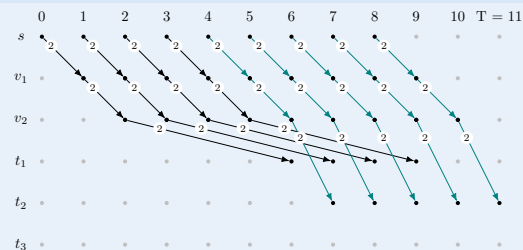
**Figure:** Network with labels representing  $(u, \tau)$  and  $b$ .



## Optimal Solution for Subgraph

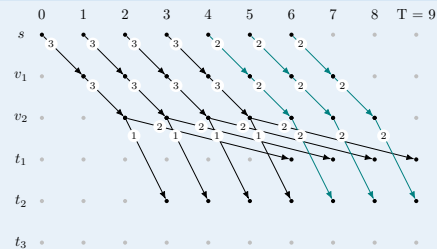


## Non-optimal Solution

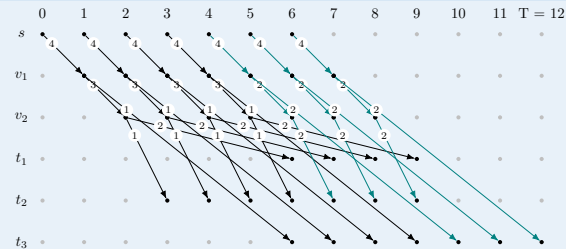


**Figure:** Network with labels representing  $(u, \tau)$  and  $b$ .

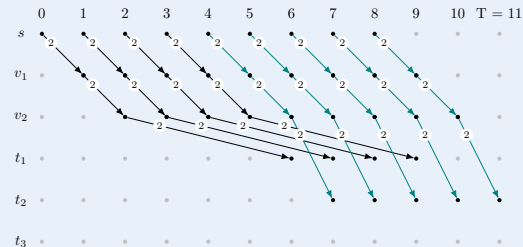
## Optimal Solution for Subgraph



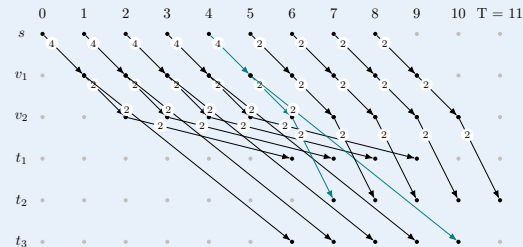
## Extension of Optimal Solution



## Non-optimal Solution



## Extension of Non-optimal Solution



## 1-Uniform Flow with Minimal Time Horizon for Tree Network

$$\min \quad d \quad \text{s.t.} \quad \sum_{i \in I_a} -b_i \leq d \cdot u(a), \quad a \in A, I_a := \{i \in \{1, \dots, h\} \mid a \in p_i\}, \quad d \in \mathbb{N}_0.$$

## 1-Uniform Flow with Minimal Time Horizon for Tree Network

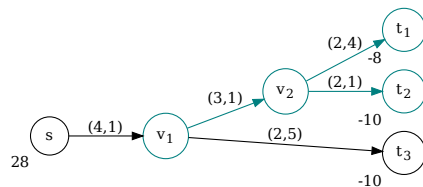
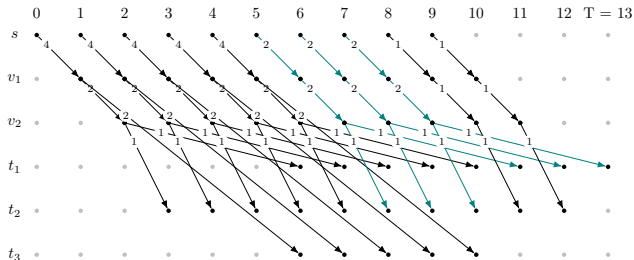
$$\min \quad d \quad \text{s.t.} \quad \sum_{i \in I_a} -b_i \leq d \cdot u(a), \quad a \in A, I_a := \{i \in \{1, \dots, h\} \mid a \in p_i\}, \quad d \in \mathbb{N}_0.$$

⇒ Linear algorithm transforms an optimal solution of the *linear relaxation* into an optimal *load-consistent flow*.

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⇒ Linear algorithm transforms an optimal solution of the *linear relaxation* into an optimal *load-consistent flow*.



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Network Flow Problems & Integrality

## 2. Tree Networks

Almost-binary Trees

Quickest Transshipment on Trees

Load-Consistent Flows

## 3. Cost Minimization at each Point in Time

## Definition

Given a network  $(G, u, \tau, c)$ , source and sink  $s, t \in V$ , and a time horizon  $T \in \mathbb{N}_0$ , find an *integer temporally repeated flow* with

- maximal flow and
- minimized maximal costs over all points in time.

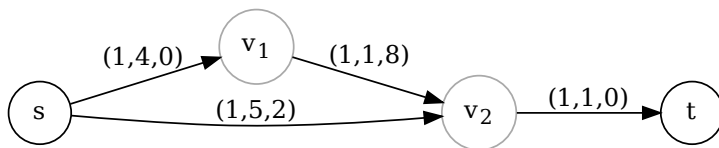


Figure: Network with labels representing  $(u, \tau, c)$ .

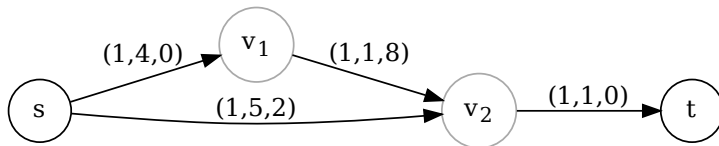
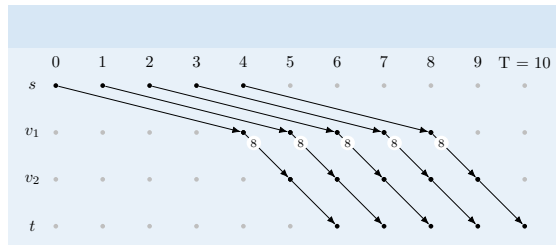
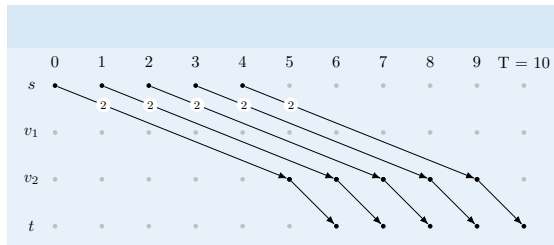


Figure: Network with labels representing  $(u, \tau, c)$ .



- Both flows have *total value* 5 and *time horizon* 10.
- The left flow has *total costs* 10, whereas the right flow has *total costs* 40.



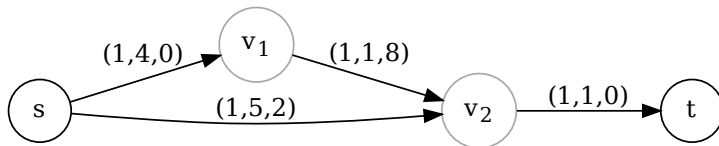
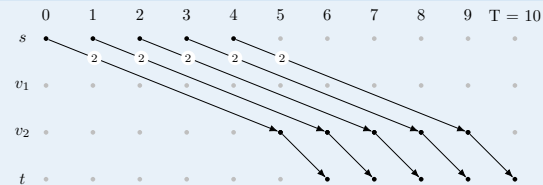
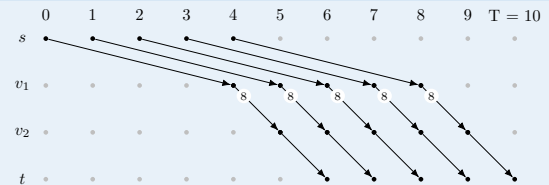


Figure: Network with labels representing  $(u, \tau, c)$ .

Maximal costs are 10 at time 4.



Maximal costs are 8 at time 4.



- Both flows have *total value* 5 and *time horizon* 10.
- The left flow has *total costs* 10, whereas the right flow has *total costs* 40.

**Listing:** Ford-Fulkerson Algorithm for Maximal  $(s,t)$ -Flows over Time

Input: Network  $(G,u,\tau)$ ,  
source and sink  $s,t \in V$ , and  
time horizon  $T$   
Output: Temporally repeated flow  $f$   
with time horizon  $T$   
with maximal flow

Calculate static  $(s,t)$ -flow  $x$   
that maximizes  
 $T \cdot \text{value}(x) - \sum_{a \in A} \tau(a) \cdot x(a)$   
Calculate path decomposition  
Construct temporally repeated flow  $f$   
with time horizon  $T$   
Return  $f$

**Listing:** Maximal  $(s,t)$ -Flows with Minimal Costs over all Points in Time

Input: Network  $(G,u,\tau,c)$ ,  
source and sink  $s,t \in V$ , and  
time horizon  $T$   
Output: Temporally repeated flow  $f$   
with time horizon  $T$   
with maximal flow and minimized  
maximal costs at each time point

Set  $d: A \rightarrow \mathbb{N}_0$ ,  $a \mapsto M \cdot \tau(a) + c(a) \cdot \tau(a)$   
Calculate static  $(s,t)$ -flow  $x$   
that maximizes  
 $M \cdot T \cdot \text{value}(x) - \sum_{a \in A} d(a) \cdot x(a)$   
Calculate path decomposition  
Construct temporally repeated flow  $f$   
with time horizon  $T$   
Return  $f$

$$\begin{aligned} T \cdot \text{value}(x) - \sum_{a \in A} \tau(a) \cdot x(a) &\Leftrightarrow M \cdot T \cdot \text{value}(x) - \sum_{a \in A} d(a) \cdot x(a) \\ &\Leftrightarrow M \cdot T \cdot \text{value}(x) - \sum_{a \in A} (M \cdot \tau(a) + c(a) \cdot \tau(a)) \cdot x(a) \\ &\Leftrightarrow M \cdot \underbrace{\left( T \cdot \text{value}(x) - \sum_{a \in A} \tau(a) \cdot x(a) \right)}_{\text{Maximize first.}} - \underbrace{\sum_{a \in A} c(a) \cdot \tau(a) \cdot x(a)}_{\text{Minimize second.}} \end{aligned}$$

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- Computation of equivalent almost-binary tree with minimal capacities
- Analyze QTP on differently structured graphs
- Explore whether the solutions of subtrees for almost-binary tree networks can be restricted to a very small (of constant size?) set of relevant solutions

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