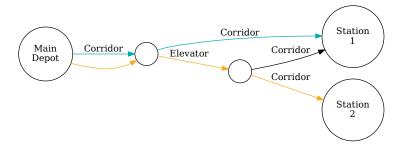


Generalized Temporally Repeated Flows for the Quickest Transshipment and Related Problems

Emma Ahrens

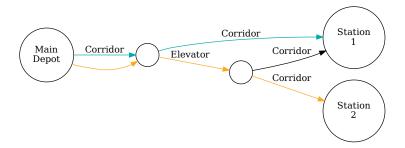
Supervised by Prof. Dr. Christina Büsing July 18, 2025





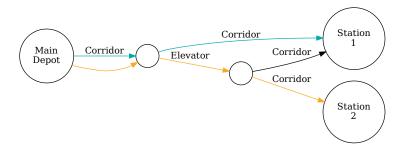
 Transportation of hospital beds during the day blocks elevators for time-critical processes





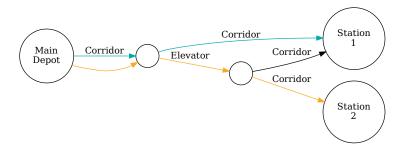
- Transportation of hospital beds during the day blocks elevators for time-critical processes
- ⇒ Distribution after the main working hours? What would be important?





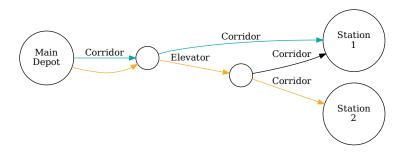
- Transportation of hospital beds during the day blocks elevators for time-critical processes
- ⇒ Distribution after the main working hours? What would be important?
- As quick as possible to relieve the employees





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





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

Contents



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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

For

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

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

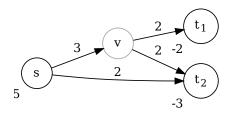


Figure: Network with labels u and b.



Definition

For

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

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

Definition

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

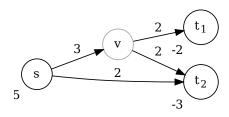


Figure: Network with labels u and b.



Definition

For

- a network (G,u), and
- a balance function *b*,

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

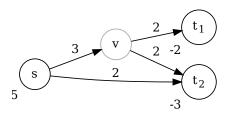


Figure: Network with labels *u* and *b*.

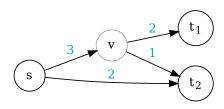


Figure: Flow represented by labels *x* on arcs.



Definition

For

- a network (G,u), and
- a balance function b,

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

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

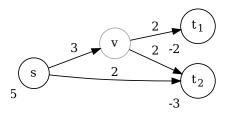


Figure: Network with labels *u* and *b*.

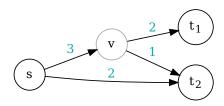


Figure: Flow represented by labels x on arcs.



Definition

For

- a network (G, u), and
- a balance function b,

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

2. the flow conservation

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

for all $v \in V$.

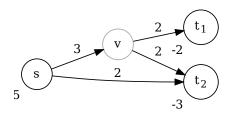


Figure: Network with labels *u* and *b*.

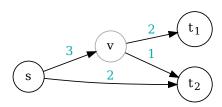


Figure: Flow represented by labels *x* on arcs.

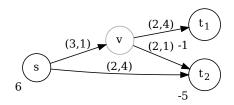


Definition

For

- a network (G, u, τ) ,
- a time horizon $T \in \mathbb{N}_0$, and
- a balance function *b*,

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



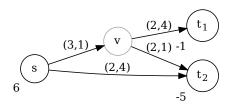


Definition

For

- a network (G, u, τ) ,
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- a balance function b,

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



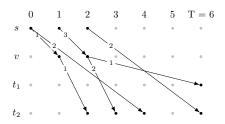


Figure: Labels represent load on arcs.



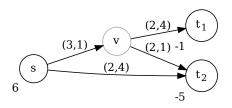
Definition

For

- a network (G, u, τ) ,
- a time horizon $T \in \mathbb{N}_0$, and
- a balance function b,

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

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



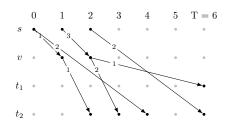


Figure: Labels represent load on arcs.



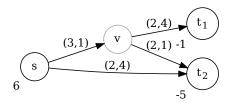
Definition

For

- a network (G, u, τ) ,
- a time horizon $T \in \mathbb{N}_0$, and
- a balance function b,

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

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



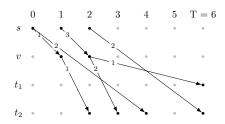


Figure: Labels represent load on arcs.



Definition

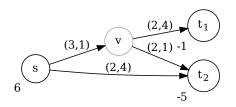
For

- a network (G, u, τ) ,
- a time horizon $T \in \mathbb{N}_0$, and
- a balance function b,

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

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

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



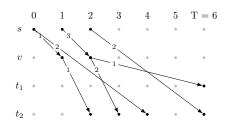


Figure: Labels represent load on arcs.



Definition

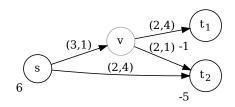
For

- a network (G, u, τ) ,
- a time horizon $T \in \mathbb{N}_0$, and
- a balance function b,

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

4. the strict flow conservation for all $v \in V$

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



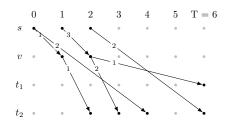


Figure: Labels represent load on arcs.



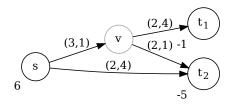
Definition

For

- a network (G, u, τ) ,
- a time horizon $T \in \mathbb{N}_0$, and
- a balance function b,

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

5. and $f_a(\theta) = 0$ for $\theta \notin \{0, \dots, T\}$.



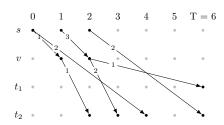


Figure: Labels represent load on arcs.

Uniform Flows

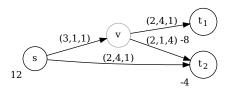


Definition

For

- a network (G, u, τ) ,
- a time horizon $T \in \mathbb{N}_0$, and
- a static flow x over (G, u) with path decomposition y : P → ℝ_{≥0} and t := max_{p∈P} τ(p),

the associated uniform flow f is



Uniform Flows

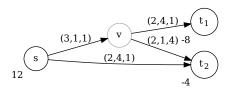


Definition

For

- a network (G, u, τ) ,
- a time horizon $T \in \mathbb{N}_0$, and
- a static flow x over (G, u) with path decomposition $y: P \to \mathbb{R}_{\geq 0}$ and $t:=\max_{p\in P} \tau(p)$,

the associated uniform flow f is



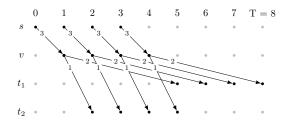


Figure: Labels represent load on arcs.

Uniform Flows



Definition

For

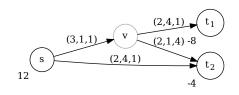
- a network (G, u, τ) ,
- a time horizon $T \in \mathbb{N}_0$, and
- a static flow x over (G, u) with path decomposition $y : P \to \mathbb{R}_{\geq 0}$ and $t := \max_{p \in P} \tau(p)$,

the associated $uniform\ flow\ f$ is

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

where

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



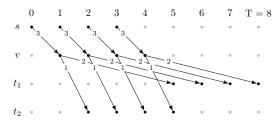


Figure: Labels represent load on arcs.

Temporally Repeated Flows

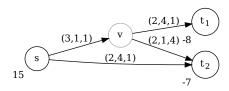


Definition

For

- a network (G, u, τ) ,
- a time horizon $T \in \mathbb{N}_0$, and
- a static flow x over (G, u) with path decomposition y : P → ℝ_{≥0} and t := max_{p∈P} τ(p),

the assoc. temporally repeated flow f is



Temporally Repeated Flows

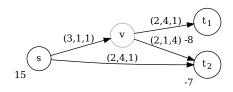


Definition

For

- a network (G, u, τ) ,
- a time horizon $T \in \mathbb{N}_0$, and
- a static flow x over (G, u) with path decomposition $y : P \to \mathbb{R}_{\geq 0}$ and $t := \max_{p \in P} \tau(p)$,

the assoc. temporally repeated flow f is



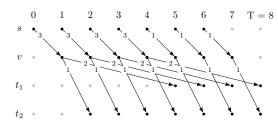


Figure: Labels represent load on arcs.

Temporally Repeated Flows



Definition

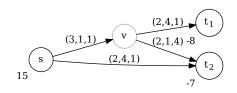
For

- a network (G, u, τ) ,
- a time horizon $T \in \mathbb{N}_0$, and
- a static flow x over (G, u) with path decomposition $y : P \to \mathbb{R}_{\geq 0}$ and $t := \max_{p \in P} \tau(p)$,

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



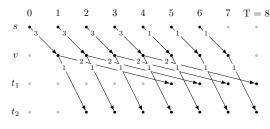
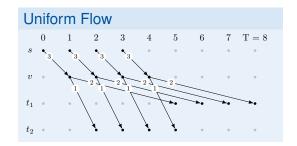
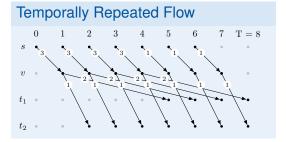


Figure: Labels represent load on arcs.

k-Uniform and *k*-Temporally Repeated Flows

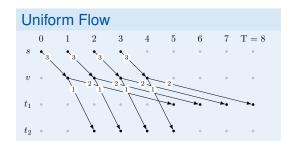


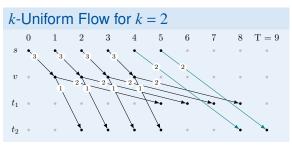


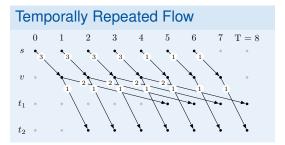


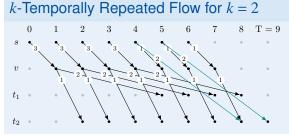
k-Uniform and k-Temporally Repeated Flows













Max Flow Problem

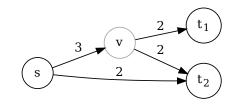


Figure: Network with labels representing u.



- Max Flow Problem
- Min Cost Flow Problem

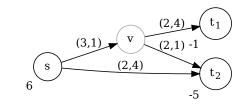
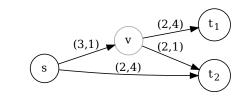


Figure: Network with labels representing (u, c) and b.

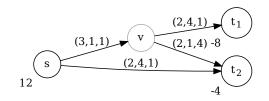


- Max Flow Problem
- Min Cost Flow Problem
- Max Flow over Time Problem





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





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

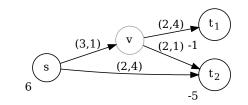


Figure: Network with labels representing (u, τ) and b.



- 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

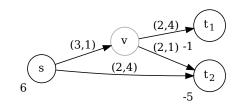
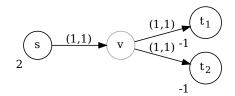


Figure: Network with labels representing (u, τ) and b.



- 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
- Min Cost Uniform Flow Problem



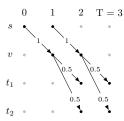
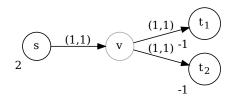


Figure: Labels represent loads on arcs.



- 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



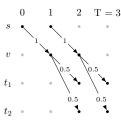


Figure: Labels represent loads on arcs.

Table of Contents



1. Theory of Flows

Network Flow Problems & Integrality

2. Tree Networks

Almost-binary Trees

Quickest Transshipment on Trees

Load-Consistent Flows



Definition

G is a tree, then (G, u, τ, c) is a *tree network*.

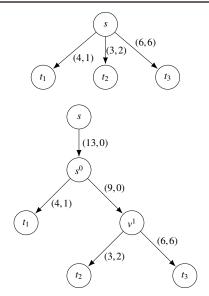


Figure: Networks with labels representing (u, τ) .



Definition

G is a tree, then (G, u, τ, c) is a *tree network*.

Definition

Flow f on (G, u, τ, c) and f' on (G', u', τ', 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.

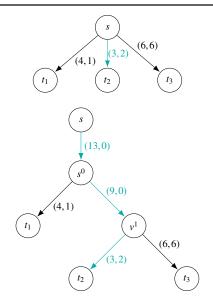


Figure: Networks with labels representing (u, τ) .



Definition

Two tree networks (G, u, τ, c) , (G', u', τ', c') are *equivalent*,

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

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

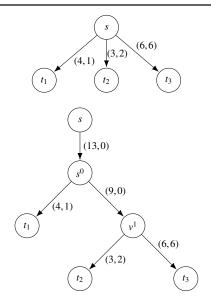


Figure: Networks with labels representing (u, τ) .



Definition

Two tree networks (G, u, τ, c) , (G', u', τ', c') are *equivalent*,

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

if for each flow f on (G, u, τ, c) there exists an equivalent flow f' on the other network (G', u', τ', 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.

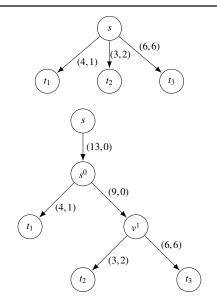


Figure: Networks with labels representing (u, τ) .

Merge Nodes



Definition

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

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

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

Lemma

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

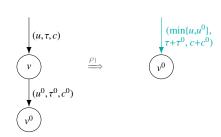


Figure: The operation ρ_1 .

Split Children



Definition

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

at most two children.

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

Lemma

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

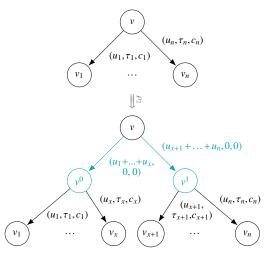


Figure: The operation ρ_2 .

Single Child



Definition

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

at most one child.

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

Lemma

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

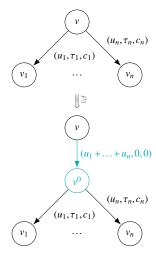


Figure: The operation ρ_3 .

Almost-binary Tree



Definition

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

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

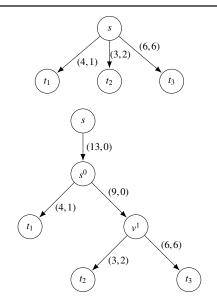


Figure: Networks with labels representing (u, τ) .

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Theorem

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

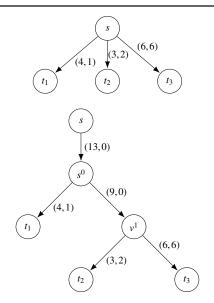


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Almost-binary Tree



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Theorem

Let (G, u, τ, 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.

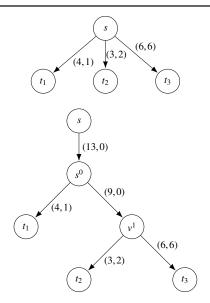
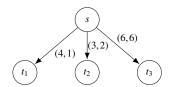


Figure: Networks with labels representing (u, τ) .

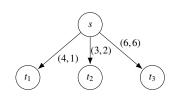
Equivalence Classes of Trees



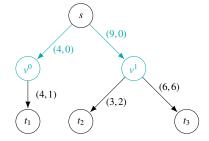


Equivalence Classes of Trees

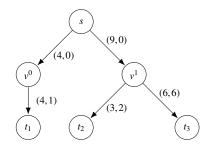




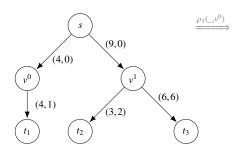


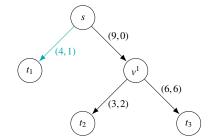




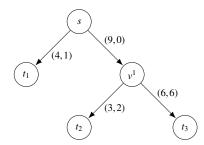




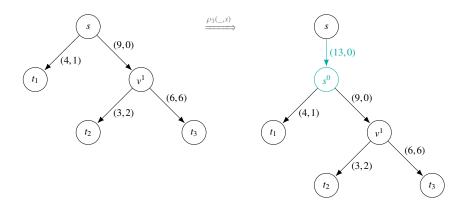




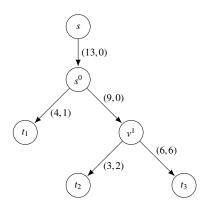




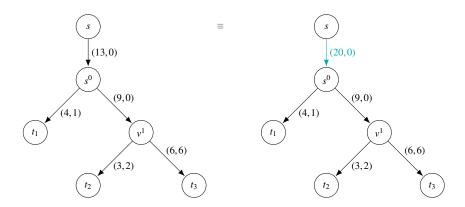












Quickest Transshipment on Trees



Definition

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

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



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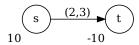


Figure: Network with labels representing (u, τ) and b.



Definition

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- · satisfies the balances and
- has minimal overall time horizon.

Lemma

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

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

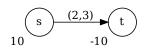


Figure: Network with labels representing (u, τ) and b.

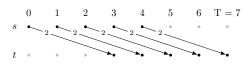


Figure: Labels represent loads on arcs.



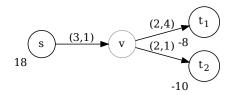


Figure: Network with labels representing (u, τ) and b.



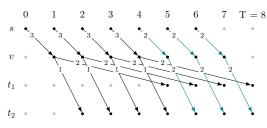


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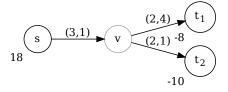


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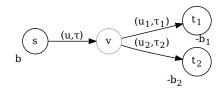


Figure: Network with labels representing (u, τ) and b.



Lemma

We set $\mathbf{u}_i := \min\{u, u_i\}, \, \boldsymbol{\tau}_i := \tau + \tau_i$. The quickest 1- or 2-uniform flow has time horizon

$$T := \min \left(\left\{ f(\mathbf{u}_{1}, \tau_{1}, b_{1}, \mathbf{u}_{2}, \tau_{2}, b_{2}) \right\}$$

$$\cup \left\{ g(\mathbf{u}_{1}, \tau_{1}, b_{1}, \mathbf{u}_{2}, \tau_{2}, b_{2}, x_{1}, x_{2}) \mid \right.$$

$$1 \le x_{1} \le \mathbf{u}_{1}, \ 1 \le x_{2} \le \mathbf{u}_{2}, \ x_{1} + x_{2} \le u \right\}$$

$$\cup \left\{ h(\tau_{1}, b_{1}, \tau_{2}, b_{2}, x_{1}, x_{2}, y_{1}, y_{2}, d) \mid \right.$$

$$1 \le x_{1} \le \mathbf{u}_{1}, \ 1 \le y_{1} \le \mathbf{u}_{1}, \ 1 \le x_{2} \le \mathbf{u}_{2},$$

$$1 \le y_{2} \le \mathbf{u}_{2}, \ x_{1} + x_{2} \le u, \ y_{1} + y_{2} \le u,$$

$$d < \min \left\{ \left[\frac{b_{1}}{x_{1}} \right], \left[\frac{b_{2}}{x_{2}} \right] \right\}, \left[\frac{b_{1} - d \cdot x_{1}}{y_{1}} \right] = \left[\frac{b_{2} - d \cdot x_{2}}{y_{2}} \right] \right\} \right).$$

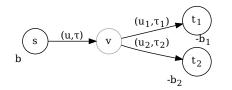


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$$\begin{split} &\textit{It is } f: \mathbb{N}_0^6 \to \mathbb{N}_0, (\mathbf{u}_1, \boldsymbol{\tau}_1, b_1, \mathbf{u}_2, \boldsymbol{\tau}_2, b_2) \mapsto \\ & \left. \left\{ \left\lceil \frac{b_1}{\mathbf{u}_1} \right\rceil + \left\lceil \frac{b_2}{\mathbf{u}_2} \right\rceil + \max \left\{ \boldsymbol{\tau}_2, \boldsymbol{\tau}_1 - \left\lceil \frac{b_2}{\mathbf{u}_2} \right\rceil \right\} - 1, \quad \boldsymbol{\tau}_1 \geq \boldsymbol{\tau}_2, \\ & f(\mathbf{u}_2, \boldsymbol{\tau}_2, b_2, \mathbf{u}_1, \boldsymbol{\tau}_1, b_1), & \textit{otherwise}. \end{split} \right.$$

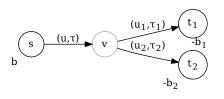


Figure: Network with labels representing (u, τ) and b.



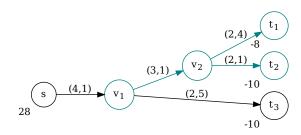
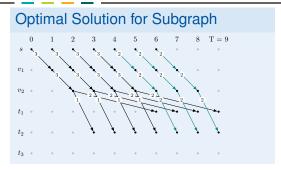
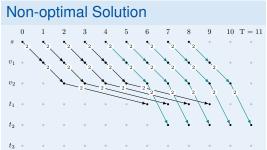


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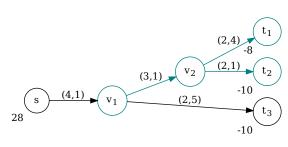
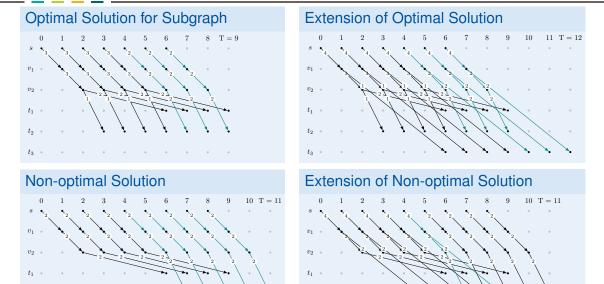


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1-Uniform Flow with Minimal Time Horizon for Tree Network

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



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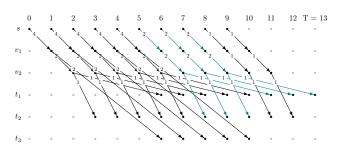
⇒ Linear algorithm transforms an optimal solution of the *linear relaxation* into an optimal *load-consistent flow*.



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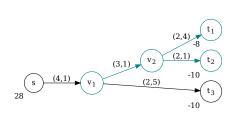


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1. Theory of Flows

Network Flow Problems & Integrality

2. Tree Networks

Almost-binary Trees
Quickest Transshipment on Trees
Load-Consistent Flows



Definition

Given a network (G, u, τ, 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.

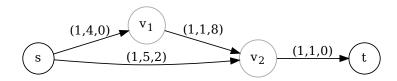


Figure: Network with labels representing (u, τ, c) .



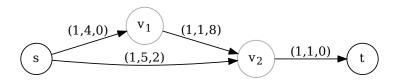
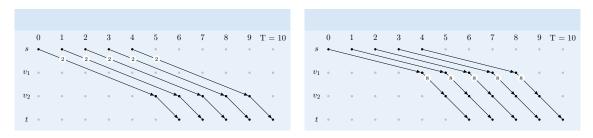


Figure: Network with labels representing (u, τ, c) .



- 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.



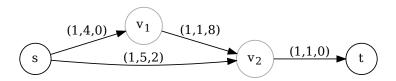
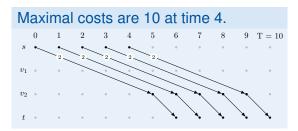
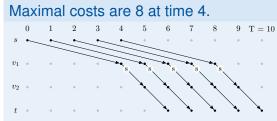


Figure: Network with labels representing (u, τ, c) .





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```
Listing: Ford-Fulkerson Algorithm for Maximal
                                               Listing: Maximal (s,t)-Flows with Minimal Costs
(s,t)-Flows over Time
                                               over all Points in Time
Input: Network (G, u, \tau),
                                               Input: Network (G, u, \tau, c),
  source and sink s,t \in V, and
                                                  source and sink s,t \in V, and
  time horizon T
                                                  time horizon T
Output: Temporally repeated flow f
                                               Output: Temporally repeated flow f
  with time horizon T
                                                  with time horizon T
  with maximal flow
                                                  with maximal flow and minimized
                                                 maximal costs at each time point
Calculate static (s,t)-flow x
  that maximizes
                                               Set d: A \to \mathbb{N}_0, a \mapsto M \cdot \tau(a) + c(a) \cdot \tau(a)
  T \cdot \text{value}(x) - \sum_{a \in A} \tau(a) \cdot x(a)
                                               Calculate static (s,t)-flow x
Calculate path decomposition
                                                 that maximizes
Construct temporally repeated flow f = M \cdot T \cdot \text{value}(x) - \sum_{a \in A} d(a) \cdot x(a)
  with time horizon T
                                               Calculate path decomposition
Return f
                                               Construct temporally repeated flow f
                                                  with time horizon T
                                               Return f
```



$$T \cdot \text{value}(x) - \sum_{a \in A} \tau(a) \cdot x(a) \quad \leftrightarrow \quad M \cdot T \cdot \text{value}(x) - \sum_{a \in A} d(a) \cdot x(a)$$

$$\Leftrightarrow \quad M \cdot T \cdot \text{value}(x) - \sum_{a \in A} \left(M \cdot \tau(a) + c(a) \cdot \tau(a) \right) \cdot x(a)$$

$$\Leftrightarrow \quad M \cdot \left(T \cdot \text{value}(x) - \sum_{a \in A} \tau(a) \cdot x(a) \right) - \sum_{a \in A} c(a) \cdot \tau(a) \cdot x(a)$$

$$\underbrace{\qquad \qquad Maximize \text{ first.}} \quad \underbrace{\qquad \qquad Minimize \text{ second.}}$$



Achievements

Several types of flows over time



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- Several types of flows over time
- Observation of tree networks and notion of equivalence



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Future Work

Computation of equivalent almost-binary tree with minimal capacities



Achievements

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- Analyze QTP on differently structured graphs



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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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