

Maximum Multi-Commodity Flow with Proportional and Flow-dependent Capacity Sharing

Durga Prasad Khanal¹, Urmila Pyakurel^{2,*}, Tanka Nath Dhamala² and Stephan Dempe³

¹ Saraswati Multiple Campus, Tribhuvan University, Kathmandu, Nepal;

² Central Department of Mathematics, Tribhuvan University, Kathmandu, Nepal;

³ Faculty of Mathematics and Computer Science, TU Bergakademie Freiberg, Freiberg, Germany.

* Corresponding author: : urmilapyakurel@gmail.com



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Icon Flow-dependent Capacity Sharing:

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Motivation



- Transshipment of more than one commodities from respective sources to the corresponding sinks is a multi-commodity flow problem.
- Maximum multi-commodity flow problem is applicable for the emergency management, supply chain of goods and transportation network.
- Sharing of the bundle arc capacity for each commodity is one of the most important issue in multi-commodity flow problem.
- Proportional capacity sharing technique shares the capacity of bundle arc in proportion to the minimum capacity of each path from respective source to the bundle arc and reduce the problem in to k independent sub-problems.
- Flow-dependent capacity sharing technique shares the capacity of bundle arc with respect to the inflow rate of the flow in predecessor arcs.

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- Ford and Fulkerson [1962]: Maxflow mincut, quickest flow, time expanded network, temporally repeated flow, multi-commodity flow.
- Fleischer and Skutella [2002]: Multi-commodity flow over time problem.
- Hall et al. [2007]: Hardness of multi-commodity flow over time problem.
- Fleischer and Skutella [2007]: Approximation solution to QMCF problem.
- Kappmeier [2015]: Solution of maximum dynamic multi-commodity flow problem using time-expanded network in pseudo-polynomial time complexity.
- Dhamala et al. [2020]: Polynomial time algorithm for quickest multi-commodity contraflow problem.
- Pyakurel and Dempe [2020]: Flow with intermediate storage.
- Khanal et al. [2021]: Maximum multi-commodity flow with intermediate storage.

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Multi-commodity Network





$$\mathcal{N} = (V, A, K, u, d_i, S, D)$$

where

$$\mathcal{N} = \mathsf{Network}$$

$$V =$$
Set of nodes

$$A =$$
Set of arcs

- u = Capacity of arc
- $S = Set of source nodes s_i$
- D =Set of sink nodes t_i
- K = Set of commodities
- d_i = Net flow of commodity i



Let u_e be the capacity of a bundle arc e, then proportional sharing of capacity u_e for each commodity $i \in K$ is,

$$u_e^i = \frac{u_a^i}{\sum\limits_{a \in P_{[s_i,v]}: i \in \mathcal{K}} u_a^i} u_e \tag{1}$$

where, $P_{[s_i,v]}$ is the path from s_i to the tail v of bundle arc e, $\forall i \in K$ and a is an arc in $P_{[s_i,v]}$ with minimum capacity.



Problem 1

For given static multi-commodity network $\mathcal{G} = (N, A, K, u, d_i, S, D)$, the maximum static multi-commodity flow problem with proportional capacity sharing is to transship the maximum flow from s_i to t_i , where shared capacity for each commodity $i \in K$ on the bundle arc is depending on the minimum capacity of paths from respective source to the tail node of the bundle arc.



In static network $\mathcal{G} = (N, A, K, u, d_i, S, D)$, the multi-commodity flow φ with proportional capacity sharing is the sum of non-negative flows $\varphi^i : A \to \mathcal{R}^+$ for each *i* with demand d_i satisfying the proportional capacity sharing Equation (1) together with the conditions (2 - 3).

$$\sum_{e \in \overrightarrow{\delta}(v)} \varphi_e^i - \sum_{e \in \overleftarrow{\delta}(v)} \varphi_e^i = \begin{cases} d_i & \text{if } v = s_i \\ -d_i & \text{if } v = t_i \\ 0 & \text{otherwise} \end{cases} \quad \forall v \in N, i \in K \qquad (2)$$
$$0 \leq \varphi_e^i \leq u_e^i \quad \forall e \in A, i \in K \qquad (3)$$



Input: Given static multi-commodity flow network $\mathcal{G} = (N, A, K, u, d_i, S, D)$. Output: Maximum static MCF on \mathcal{G} with proportional capacity sharing.

- Construct k independent sub-problems by proportional capacity sharing (1) on bundle arcs for all i ∈ K.
- **2** Compute the solution φ_i to the static maximum flow problem for all *i*.

3 Maximum flow
$$|\varphi| = \sum_{i \in K} \varphi_i$$
.

Theorem: Algorithm 1 solves the maximum static MCF problem correctly in polynomial time complexity.

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For a given dynamic network \mathcal{G} with constant transit times τ on arc e, the MCF over time function f with proportional capacity sharing is the sum of flows $f^i: A \times \mathbb{T} \to \mathcal{R}^+$, satisfying the proportional capacity sharing Equation (1) together with the constraints (4 - 6).

$$\sum_{e \in \overrightarrow{\delta}(v)} \sum_{\theta=0}^{T} f_{e}^{i}(\theta) - \sum_{e \in \overleftarrow{\delta}(v)} \sum_{\theta=0}^{T} f_{e}^{i}(\theta) = \begin{cases} d_{i} & \text{if } v = s_{i} \\ -d_{i} & \text{if } v = t_{i} \\ 0 & \text{otherwise} \end{cases} \quad \forall i \in K, \ \forall v \in N \quad (4)$$

$$\sum_{e \in \overrightarrow{\delta}(v)} \sum_{\theta=0}^{\beta} f_{e}^{i}(\theta) - \sum_{e \in \overleftarrow{\delta}(v)} \sum_{\theta=0}^{\beta} f_{e}^{i}(\theta) \leq 0 \ \forall \ v \notin \{s_{i}, t_{i}\}, \ i \in K, \ \beta \in \mathbb{T} \quad (5)$$

$$0 \leq f_{e}^{i}(\theta) \leq u_{e}^{i} \ \forall e \in A, \ \theta \in \mathbb{T} \text{ and } i \in K. \quad (6)$$

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Algorithm 2: Dynamic



Input: Given dynamic multi-commodity flow network $\mathcal{G} = (N, A, K, u, \tau, d_i, S, D, T).$

Output: Maximum dynamic MCF on $\mathcal G$ with proportional capacity sharing.

- Construct k independent sub-problems by proportional capacity sharing (1) on bundle arcs for all i ∈ K.
- **2** Compute the maximum static flow φ_i for all *i* using Algorithm 1.
- 3 Decompose flow φ_i into path flows φ_P^i .
- Otermine maximum dynamic flow for each i ∈ K using temporally repeated flow such that fⁱ = ∑_{P∈Pi} (T + 1 − τ_P)φⁱ_P.

$$|f| = \sum_{i \in K} f^i.$$

Theorem: Algorithm 2 provides the feasible solution to the maximum dynamic MCF problem with proportional capacity sharing in polynomial time.

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At any instance of time θ , if a bundle arc e = (v, w) with capacity u_e holds more than one commodities $i \in K$, then the flow-dependent capacity sharing of u_e for each commodity $i \in K$ is,

$$u_e^i(\theta) = \frac{f_a^i(\theta - \tau_a)}{\sum\limits_{a \in \alpha(e): i \in K} f_a^i(\theta - \tau_a)} u_e$$
(7)

where, $\alpha(e)$ is the set of predecessor arcs of bundle arc e so that $a \in \alpha(e) \implies head(a) = tail(e)$ and $u_e^i(\theta)$ is the portion of capacity of arc e for commodity i at time θ .

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Problem 2

For given static multi-commodity network $\mathcal{G} = (N, A, K, u, d_i, S, D)$, the maximum static multi-commodity flow problem with proportional capacity sharing is to transship the maximum flow from s_i to t_i , where shared capacity for each commodity $i \in K$ on the bundle arc is depending on the minimum capacity of paths from respective source to the tail node of the bundle arc.

Flow Model



For a given dynamic network \mathcal{G} with constant transit times τ on arc e, the multi-commodity flow over time function f with flow-dependent capacity sharing is the sum of flows $f^i : A \times \mathbb{T} \to \mathcal{R}^+$, satisfying the constraints (8 - 12).

$$\sum_{e \in \overrightarrow{\delta}(v)} \sum_{\theta=0}^{T} f_{e}^{i}(\theta) - \sum_{e \in \overleftarrow{\delta}(v)} \sum_{\theta=0}^{T} f_{e}^{i}(\theta) = \begin{cases} d_{i} & \text{if } v = s_{i} \\ -d_{i} & \text{if } v = t_{i} \\ 0 & \text{otherwise} \end{cases} \forall i \in K, \ \forall v \in N \quad (8)$$

$$\sum_{e \in \overrightarrow{\delta}(v)} \sum_{\theta=0}^{\beta} f_{e}^{i}(\theta) - \sum_{e \in \overleftarrow{\delta}(v)} \sum_{\theta=0}^{\beta} f_{e}^{i}(\theta) \leq 0 \ \forall \ v \notin \{s_{i}, t_{i}\}, \ i \in K, \ \beta \in \mathbb{T} \quad (9)$$

$$\sum_{i \in K} f_{e}^{i}(\theta) \leq u_{e} \ \forall e \in A \quad (10)$$

$$u_{e}^{i}(\theta) = \frac{f_{a}^{i}(\theta - \tau_{a})}{\sum_{a \in \alpha(e): i \in K} f_{a}^{i}(\theta - \tau_{a})} u_{e} \ \forall e \in A \quad (11)$$

$$f_{e}^{i}(\theta) \geq 0 \ \forall i \in K \text{ and } e \in A. \quad (12)$$

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Figure: (b) represents the time-expanded layer graph $\mathcal{G}^{\mathcal{T}}$ of given network (a).

Algorithm 3



Input: Given dynamic multi-commodity flow network

 $\mathcal{G} = (N, A, K, u, \tau, d_i, S, D, T).$

Output: Maximum dynamic MCF on ${\mathcal G}$ with proportional capacity sharing.

- **(**) Construct a multi-commodity time-expanded layer graph \mathcal{G}^{T} .
- Share the capacity on bundle arcs (parallel arcs in G^T) with flow-dependent capacity sharing (7) at each θ ∈ T.
- Oecompose the static flow φ_i into path flows φⁱ_P(θ) in G^T at each time step θ.

$$|f| = \sum_{i \in K} \varphi_P^i.$$

Theorem: A feasible solution to the maximum dynamic MCF problem with flow-dependent capacity sharing can be obtained by using Algorithm 3 in pseudo-polynomial time.

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Stay Safe !!





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