

Flow Variants

Lecture 16

March 30, 2021

Most slides are courtesy Prof. Chekuri

Generalizations of Flow

We have seen s - t flow. Flow problems admit several generalizations and variations.

- Demands and Supplies (we have already seen them)
- Circulations
- Lower bounds in addition to upper bounds
- Minimum cost flows and circulations
- Flows with losses
- Flows with time delays
- Multi-commodity flows
- ...

Many applications, connections, algorithms.

Part I

Circulations

Circulations

Definition

Circulation in a network $G = (V, E)$, is function $f : E \rightarrow \mathbb{R}^{\geq 0}$ s.t.

- ① **Conservation Constraint:** For each vertex v :

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

- ② **Capacity Constraint:** For each edge e , $f(e) \leq c(e)$

No source or sink. $f(e) = 0$ for all e is a valid circulation.

Circulation with lower bounds

Circulations are useful mainly in conjunction with *lower bounds*. Given a network $G = (V, E)$ with *capacities* $c : E \rightarrow \mathbb{R}^{\geq 0}$ and *lower bounds* $\ell : E \rightarrow \mathbb{R}^{\geq 0}$.

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- 3 **Lower bound Constraint:** For each edge e , $f(e) \geq \ell(e)$

Circulation problem

Problem

Input A network G with capacity c and lower bound ℓ

Goal Find a feasible circulation

Simply a feasibility problem.

Observation: As hard as the s - t maxflow!

Reducing Max-flow to Circulation

Decision version of max-flow.

Problem

Input A network G with capacity c and source s and sink t and number F .

Goal Is there an s - t flow of value at least v in G ?

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- 1 set $\ell(e) = 0$ for each e in G
- 2 add new edge (t, s) with lower bound v and upper bound ∞

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Claim

There exists a flow of value v from s to t in G if and only if there exists a feasible circulation in G' .

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Circulation problem can be reduced to s - t flow and hence they are polynomial-time equivalent. See Kleinberg-Tardos Chapter 7 for details of the reduction

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Important properties of circulations:

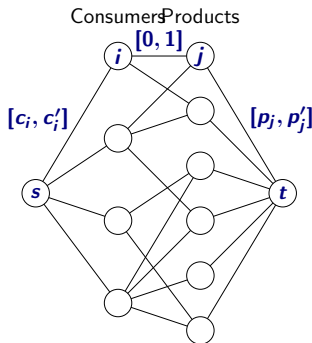
- Reduction shows that one can find in $O(mn)$ time a feasible circulation in a network with capacities and lower bounds
- If edge capacities and lower bounds are integer valued then there is always a feasible integer-valued circulation
- Hoffman's circulation theorem is the equivalent of maxflow-mincut theorem.
- Circulation can be decomposed into at most m cycles in $O(mn)$ time.

Survey Design

Application of Circulations

- ① Design survey to find information about n_1 products from n_2 customers.
- ② Can ask customer questions only about products purchased in the past.
- ③ Customer can only be asked about at most c'_i products and at least c_i products.
- ④ For each product need to ask at east p_i consumers and at most p'_i consumers.

Reduction to Circulation



- 1 include edge (i, j) if customer i has bought product j
- 2 Add edge (t, s) with lower bound 0 and upper bound ∞ .
 - 1 Consumer i is asked about product j if the integral flow on edge (i, j) is 1

Part II

Minimum Cost Flows

Minimum Cost Flows

- ① **Input:** Given a flow network G and also edge costs, $w(e)$ for edge e , and a flow requirement F .
- ② **Goal:** Find a *minimum cost* flow of value F from s to t
- ③ **Goal:** Find a *minimum cost* maximum s - t flow

Given flow $f : E \rightarrow R^+$, cost of flow = $\sum_{e \in E} w(e)f(e)$.

Note: costs can be negative. An optimum solution may need cycles.

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Much more general than the shortest path problem.

Minimum Cost Flow: Facts

- ① problem can be solved efficiently in polynomial time
 - ① $O(nm \log C \log(nW))$ time algorithm where C is maximum edge capacity and W is maximum edge cost
 - ② $O(m \log n(m + n \log n))$ time strongly polynomial time algorithm
- ② for integer capacities there is always an optimum solution in which flow is integral

Min-Cost Flow: Residual Graphs

Residual graph when there are costs:

Definition

For a network $G = (V, E)$ and flow f , the **residual graph** $G_{f,w} = (V', E')$ of G with respect to f and w is

- ① $V' = V$,
- ② **Forward Edges:** For each edge $e \in E$ with $f(e) < c(e)$, we add $e \in E'$ with capacity $c(e) - f(e)$. Cost $w'(e) = w(e)$.
- ③ **Backward Edges:** For each edge $e = (u, v) \in E$ with $f(e) > 0$, we add $(v, u) \in E'$ with capacity $f(e)$. Cost $w'(e) = -w(e)$.

Min-Cost Flow: Optimality Condition

Question: Suppose f is a max s - t flow in G . When is f a min-cost a minimum cost max-flow?

Min-Cost Flow: Optimality Condition

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If and only if there is *no negative-cost cycle* in G_f .

- If there is a negative cost cycle we can augment along the cycle and reduce the cost of f (note that value of f does not change)
- Suppose f' is another maxflow of less cost. One can show that $f' - f$ is a circulation in G_f (since both are maxflows) which means that $f' - f$ can be decomposed into cycles. Since f' has less cost than f there must be a negative cost cycle.

Min-Cost Flwo: Cycle-canceling algorithm

Goal: Given G with integer capacities, non-negative weights, find s - t maxflow of with minimum cost.

Cycle-Canceling-Alg

Compute a maxflow f in G (ignoring costs)

$G_{f,w}$ is residual graph of G with respect to f

while there is a negative weight cycle C in $G_{f,w}$ **do**

 let C be a negative weight cycle in $G_{f,w}$

 Augment one unit of flow along C and update f

 Construct new residual graph $G_{f,w}$.

Output f

Like Ford-Fulkerson the run-time is pseudo-polynomial in costs. Can be implemented to run in $O(m^2 n C W)$ time where $C = \max_e c(e)$ and $W = \max_e |w(e)|$.

Min-Cost Flow: Successive Shortest Path Alg

Goal: Given G with integer capacities, **non-negative** weights, and integer k , find s - t flow of value k with minimum cost.

Successive-Shortest-Path-Alg

for every edge e , $f(e) = 0$

$G_{f,w}$ is residual graph of G with respect to f

while $v(f) < k$ and $G_{f,w}$ has a simple s - t path **do**

let P be a *shortest* s - t path in $G_{f,w}$

Augment one unit of flow along P and update f

Construct new residual graph $G_{f,w}$.

Algorithm gives optimum solution. Shows existence of integral optimum solution for integer capacities. Run time is $O(mk \log m)$, and in the worst-case, $O(mC \log m)$.

Maximum Profit Flow?

Can we find a maxflow of maximum profit?