

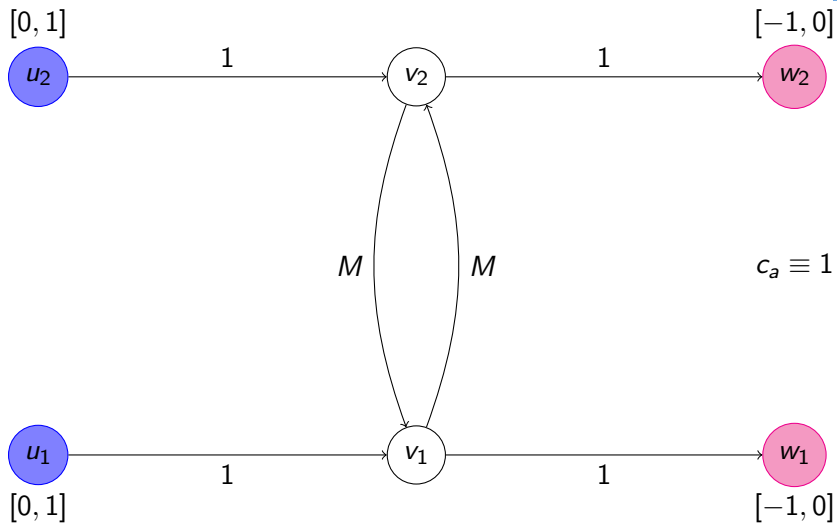
The Maximum Minimum Cost Flow Problem

Kai Hoppmann-Baum

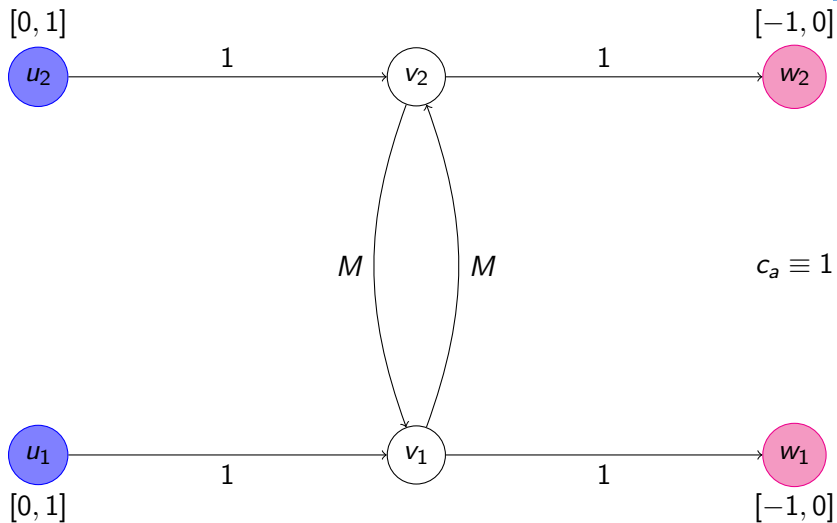


ALOP Autumn School on Bilevel Optimization

Example Flow Network

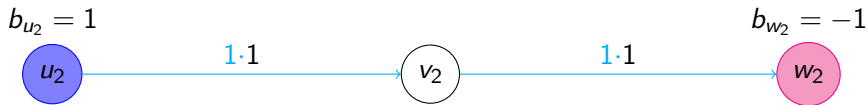


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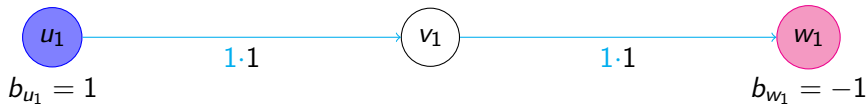


Difficulty \approx Optimal solution value of induced MCF instance $\sum_{a \in A} l_a f_a$.

Greedy Solution - Insert Maximum Possible Flow

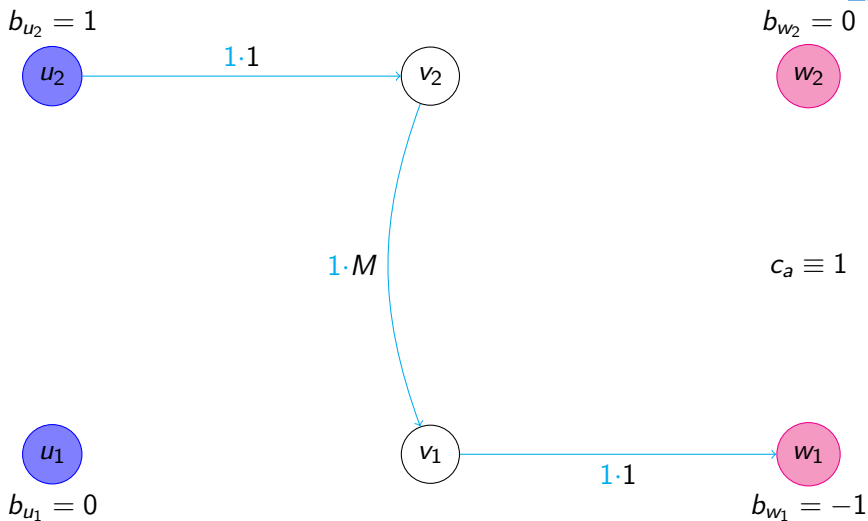


$$c_a \equiv 1$$



Optimal MCF solution value is 4.

Solution with Maximum Difficulty



Optimal MCF solution value is $M + 2$.

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Lemma (Hoppmann '19)

MMCF is NP-hard and remains NP-hard in the uncapacitated case.

$$\max_b \quad \sum_{a \in A} \ell_a f_a$$

$$\text{s.t. } b_v \in [\underline{b}_v, \bar{b}_v]$$

$$\forall v \in V^+ \cup V^-$$

$$\min_f \quad \sum_{a \in A} \ell_a f_a$$

$$\text{s.t. } \sum_{a \in \delta^+(u)} f_a - \sum_{a \in \delta^-(u)} f_a = b_u$$

$$\forall u \in V^+$$

$$\sum_{a \in \delta^+(w)} f_a - \sum_{a \in \delta^-(w)} f_a = b_w$$

$$\forall w \in V^-$$


$$\sum_{a \in \delta^+(v)} f_a - \sum_{a \in \delta^-(v)} f_a = 0$$

$$\forall v \in V \setminus (V^+ \cup V^-)$$

$$f_a \in [0, c_a] \quad \forall a \in A$$

- ▶ Tighten variable bounds and big-Ms in KKT-reformulation.
- ▶ Reduce size of flow network or derive equivalent graph representation with less nodes and/or arcs.
- ▶ Derive stronger hardness results on capacitated variant.

Thank you for your attention!

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