

Lecture #9

Last Time: Capacity Scaling and Min Cost Matching

↑
how to reduce dependence from U to $\log U$

Today: Min Cost Flow and Goldberg-Tarjan

Recall:

Klein's Cycle Cancelling

Find maximum s - t flow

while \exists negative cost cycle C in residual

Augment along C by $\Delta_H(C)$

Update residual

Last time we talked about optimality conditions for min cost P.M., but analogue

Lemma: A maximum s - t flow f has minimum cost (among ^{all?} max flows) iff there is no negative cost cycle in residual

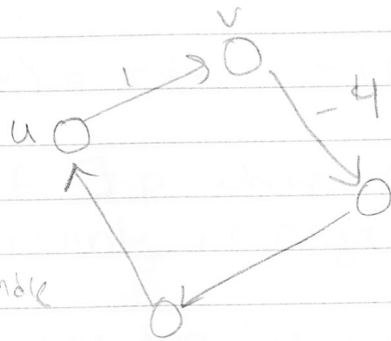
How do we implement the algorithm, and find a negative cost cycle?

Note: (a) Dijkstra's algorithm

* (b) Bellman-Ford *

Recall: Bellman-Ford computes cheapest path from $s \rightarrow v$, for all v but gets stuck if negative cost cycle

technicality: might not be reachable from s , but easy to handle



e.g. cheapest path from $s \rightarrow v$ is $-\infty$ cost

running time: $O(mn)$

How many iterations does Klein's algorithm take?

All capacities, costs integers at most U and C
↑
 bd on magnitude of costs

Initial cost (in residual)
 0

Final cost
 $\geq -mCU$

\Rightarrow at most mCU iterations

overall running time: $O(m^2nCU)$

what is this called? in residual quasipolynomial

Goldberg-Tarjan: cycle of minimum mean cost

choose e that minimizes $\frac{c_H(e)}{|e|}$
↑
 number of arcs in e

Let's work towards analyzing this...

We need notion of reduced costs

For any $p: V \rightarrow \mathbb{R}$, we define

$$c_p(u, v) = c(u, v) + p(u) - p(v)$$

Intuition: If $\exists p$ where $c_p(u, v) \geq 0$ then there is certainly no negative cost cycle

special case
Converse is true too (we will prove something stronger)

Let $M = \min_{e \in E} \frac{c_H(e)}{|e|}$ and let ε be defined as

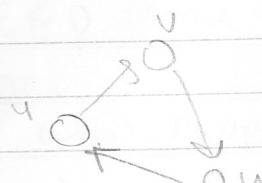
largest value δ s.t. $\exists p$ with $c_p(u, v) \geq \delta \forall (u, v)$

Lemma 1: $M = \varepsilon$

claim 1
claim 2
Proof: First we show $M \geq \varepsilon$. This follows because

$c(e) = c_p(e)$ for any cycle (telescoping)

e.g.


$$\begin{aligned} c(e) &= c(u, v) + c(v, w) + c(w, u) \\ c_p(e) &= c(u, v) + p(u) - p(v) \\ &\quad + c(v, w) + p(v) - p(w) \\ &\quad + c(w, u) + p(w) - p(u) \end{aligned}$$

$$\text{and } c_p(u, v) \geq \delta \forall (u, v) \Rightarrow \frac{c_p(e)}{|e|} \geq \delta$$

Next we show $M \leq \varepsilon$. Define a helper cost

$$c'(u, v) = c(u, v) - M$$

By definition of μ , c' has no negative cost cycles

Set $p(u) = \text{cost of cheapest path from } s \rightarrow u$
according to c'

Then $p(v) \leq p(u) + c'(u, v)$ by defn of cheapest path

Rearranging we have

$$0 \leq c'(u, v) + p(u) - p(v) = \underbrace{c(u, v) + p(u) - p(v)}_{c_p(u, v)} - \mu$$

This completes the proof. ~~QED~~

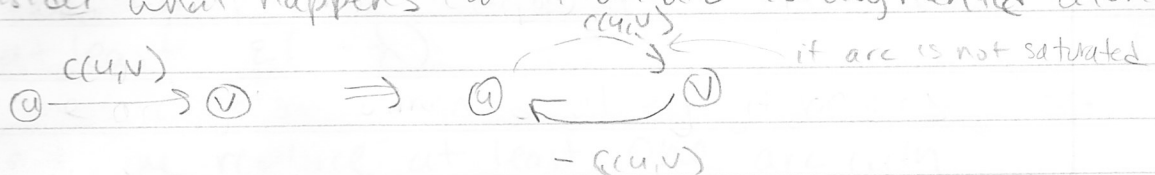
Lemma 2: In the Goldberg-Tarjan algorithm, ϵ is non decreasing

i.e. let ϵ_1 be current value for residual, and ϵ_2 be new value after augmenting then $\epsilon_2 \geq \epsilon_1$

Proof: Let p be such that $c_p(u, v) \geq \epsilon \forall (u, v)$

Recall $\epsilon < 0$ (since we only augment when negative cycle).

Consider what happens when an arc is augmented along:



If we use same potential p we get new reduced cost

$$-c(u, v) + p(v) - p(u) = -c_p(u, v)$$

When we augment along a cycle with minimum

mean cost, we only use arcs whose reduced cost is exactly ϵ . ^{why? otherwise wouldn't be minimum mean cost.} Thus some reduced cost(s) of ϵ

get replaced with $-\epsilon$, and same potential p gives reduced costs of at least ϵ after augmentation. \square

Now we can analyze Goldberg-Tarjan

Theorem: The number of iterations in the Goldberg-Tarjan algorithm is at most $O(mn \log n C)$

Let $\epsilon(f) = \epsilon$ for residual graph for flow f

Lemma 3: Let f be a maximum st flow, and f' be obtained by m iterations of augmenting via Goldberg-Tarjan rule, then

$$\epsilon(f') \geq \left(1 - \frac{1}{n}\right) \epsilon(f)$$

fixed on 3/2

Proof: Let p be optimal potential for f .

If at any point we use a cycle with a nonnegative reduced cost, then the minimum mean cost of it is at least $\epsilon(1 - \frac{1}{n})$.

If not, we replace at least one arc with negative reduced cost, by one with positive.

After at most m iterations, we run out of arcs with negative reduced cost. \square

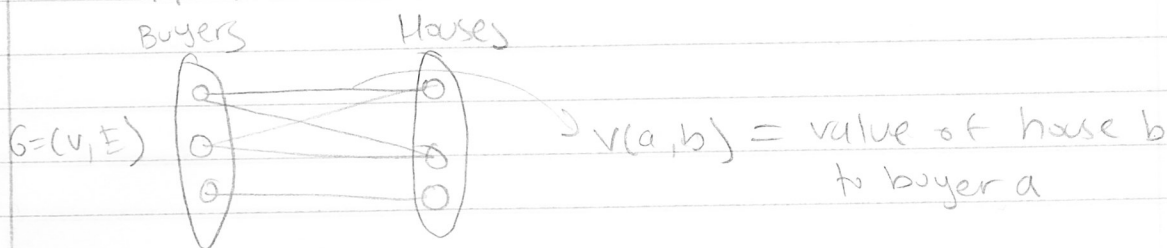
Now finishing proof

$$\begin{aligned} \mathbb{E}(f_{\text{last}}) &\geq \left(1 - \frac{1}{n}\right)^{\frac{1}{2}n \ln nc} \mathbb{E}(f_{\text{first}}) \\ &\geq (-c) e^{-2 \ln nc} = \frac{-c}{n^2 c^2} > \frac{-1}{n} \end{aligned}$$

not reduced, original!
↓

Since all costs are integer this implies there is no negative cost cycle. \square

An Application



Problem 11.14

Let $c(a,b) = -v(a,b)$, recall can find minimum M

cost perfect matching M via Goldberg-Tarjan
(suppose M is unique min cost p.m.)

$\exists p: A \cup B \rightarrow \mathbb{R}$ be potentials so that

$$c_p(a,b) = c(a,b) + p(a) - p(b) = 0 \quad \forall (a,b) \in M$$

$$c_p(a,b) > 0 \quad \forall (a,b) \in E \setminus M$$

If we choose $-p(b) \equiv$ price of house b , then a will "buy" house b iff \dots

$$v(a,b') + p(b') < v(a,b) + p(b) \quad \forall b' \neq b$$

Rearranging

$$\frac{c(a,b) - p(b)}{+ p(a)} < \frac{c(a,b') - p(b')}{+ p(a)}$$

$$0 = c_p(a,b) < c_p(a,b')$$

thus for these prices, everyone will agree on maximum utility soln.