## CS270: Lecture 2.

Admin:
Check Piazza.
Today:

- Finish Path Routing
- ????


## Terminology

Routing: Paths $p_{1}, p_{2}, \ldots, p_{k}, p_{i}$ connects $s_{i}$ and $t_{i}$
Congestion of edge, e: $c(e)$
number of paths in routing that contain $e$.
Congestion of routing: maximum congestion of any edge.
Find routing that minimizes congestion (or maximum congestion.)

## Path Routing.

Given $G=(V, E),\left(s_{1}, t_{1}\right), \ldots,\left(s_{k}, t_{k}\right)$, find a set of $k$ paths connecting $s_{i}$ and $t_{i}$ and minimize max load on any edge.


Value: 3

Value: 2

## Toll problem.

Given $G=(V, E),\left(s_{1}, t_{1}\right) \ldots\left(s_{k}, t_{k}\right)$, find a set of $k$ paths assign one unit of "toll" to edges to maximize total toll for connecting pairs.


## Another problem

Given $G=(V, E),\left(s_{1}, t_{1}\right), \ldots,\left(s_{k}, t_{k}\right)$, find a set of $k$ paths assign one unit of "toll" to edges to maximize total toll for connecting pairs.


Assign $\frac{1}{11}$ on each of 11 edges
Toll paid: $\frac{3}{11}+\frac{3}{11}+\frac{3}{11}=\frac{9}{11}$
Can we do better?
Assign $1 / 2$ on these two edges. Toll paid: $\frac{1}{2}+\frac{1}{2}+\frac{1}{2}=\frac{3}{2}$

Toll: Terminology.

## $d(e)$ - toll assigned to edge $e$.

Note: $\sum_{e} d(e)=1 . d(p)$ - total toll assigned to path $p$. $d(u, v)$ - total assigned to shortest path between $u$ and $v$. $d(x)$ - polymerpic polymorphic
$x$ could be edge, path, or pair.

## Toll is lower bound on Path Routing.

## From before:

Max bigger than minimum weighted average:
$\max _{e} c(e)>\sum_{e} c(e) d(e)$
Total length is total congestion
$\Sigma_{e} c(e) d(e)=\sum_{i} d\left(p_{i}\right)$
Each path, $p_{i}$, in routing has length $d\left(p_{i}\right) \geq d\left(s_{i}, t_{i}\right)$.

$$
\max _{e} c(e) \geq \sum_{e} c(e) d(e)=\sum_{i} d\left(p_{i}\right) \geq \sum_{i} d\left(s_{i}, t_{i}\right) .
$$

A toll solution is lower bound on any routing solution.
Any routing solution is an upper bound on a toll solution.

## Getting to equilibrium

## Maybe no equilibrium!

Approximate equilibrium:
Each path is routed along a path with length within a factor of 3 of the shortest path and $d(e) \propto 2^{c(e)}$

Lose a factor of three at the beginning.
$c_{\text {opt }} \geq \sum_{i} d\left(s_{i}, t_{i}\right) \geq \frac{1}{3} \sum_{e} d\left(p_{i}\right)=\frac{1}{3} \sum_{e} d(e) c(e)$
We obtain $c_{\max }=3\left(1+\frac{1}{m}\right) c_{\text {opt }}+2 \log m$.
This is worse!
What do we gain?

## Algorithm

Assign tolls according to routing
How to route? Shortest paths!
Assign routing according to tolls
How to assign tolls? Higher tolls on congested edges.
Toll: $d(e)=\propto 2^{c(e)} . \sum_{e} d(e)=1$.
Equilibrium:
The shortest path routing has has $d(e) \propto 2^{c(e)}$
"The routing is stable, the tolls are stable."
Routing: each path $p_{i}$ in routing is a shortest path w.r.t $d(\cdot)$
Tolls: ...where $d(e)$ is defined w.r.t. to current routing. Subtlety here due to $\sum_{e} d(e)=1$.

## An algorithm!

Repeat: reroute any path that is off by a factor of 3 .
(Note: $d(e)$ recomputed every rerouting.)


Potential function: $\sum_{e} w(e), w(e)=2^{c(e)}$ Moving path:
Divides $w(e)$ along long path (with $w(p)$ of $X$ ) by two.
Multiplies $w(e)$ along shorter $(w(p) \leq X / 3)$ path by two. $-\frac{x}{2}+\frac{x}{3}=-\frac{x}{6}$
Potential function decreases. $\Longrightarrow$ termination and existence.

## How good is equilibrium?

Path is routed along shortest path and $d(e)=\frac{2^{c(e)}}{\sum_{e^{\prime}} 2^{2\left(e^{\prime}\right)}}$.
For $e$ with $c(e) \leq c_{\text {max }}-2 \log m ; 2^{c(e)} \leq 2^{c_{\text {max }}-2 \log m}=\frac{2^{c_{\text {max }}}}{m^{2}}$
$c_{\text {opt }} \geq \sum_{i} d\left(s_{i}, t_{i}\right)=\sum_{e} d(e) c(e)$
$=\sum_{e} \frac{2^{c(e)}}{\sum_{e^{\prime}} 2^{c\left(e^{\prime}\right)}} c(e)=\frac{\sum_{e} 2^{c(e)} c(e)}{\sum_{e} 2^{c(e)}}$ Let $c_{t}=c_{\text {max }}-2 \log m$.
$\geq \frac{\sum_{e: c(e)>c_{t}} 2^{c(e)} c(e)}{\sum_{e: c(e)>c_{t}} t^{c(e)}+\sum_{e: c(e)<c_{t}} 2^{c(e)}}$
$\geq \frac{\left(c_{t}\right) \sum_{e: c(e)>c_{t}} 2^{c(e)}}{\left(1+\frac{1}{m}\right) \sum_{e: c(e)>c_{t}} 2^{c(e)}}$
$\geq \frac{\left(c_{t}\right)}{1+1}=\frac{c_{\text {max }}-2 \log m}{(1+1)}$

Or $c_{\text {max }} \leq\left(1+\frac{1}{m}\right) c_{o p t}+2 \log m$
(Almost) within additive term of $2 \log m$ of optimal!

Tuning...

Replace $d(e)=(1+\varepsilon)^{c(e)}$
Replace factor of 3 by $(1+2 \varepsilon)$
$c_{\max } \leq(1+2 \varepsilon) c_{o p t}+2 \log m / \varepsilon .$. (Roughly)
Fractional paths?

Revisit Equilibrium.
Solution Pair: $\left(\left\{p_{i}\right\}, d()\right)$
Toll Solution Value: $\sum_{i} d\left(s_{i}, t_{i}\right)$. Path Routing Value: $\max _{e} c(e)$. Toll player assigns toll on only maximally congested edges. Routing player routes on only cheapest paths.
Routing $R$ uses shortest paths. Summation Switch
$d(\theta) \geq 0$. Only for on max congestion. $\Sigma_{e} d(\theta)=1$
$\sum_{i} d\left(s_{i}, t_{i}\right)=\sum_{i} d\left(p_{i}\right)$
$=\sum_{e} c(e) d(e)$
$=\sum_{e: d(e)>0} c(e) d(e)$
$=\sum_{e: d(e)>0} d(e)\left(\max _{e} c(e)\right)$
$=\max c(e)$
Any routing solution value $\geq$ Any toll solution value Both these solutions are optimal!!!!! Complementary slackness. Why all the mess before? To get an algorithm!

Wrap up.

Dueling players:
Toll player raises tolls on congested edges.
Congestion player avoids tolls.
Converges to near optimal solution!
A lower bound is "necessary" (natural),
and helpful (mysterious?)!
Geometric View: Smooth. Gradient Descent. Stepsize.

## Algorithm:exact?



Not shortest when tolls on top.
Hmmm..
Uh oh?
Route half a unit on both!
Hey! Fractiona!!
Use previous algorithms but route two paths between each pair.
Half integral!
Optimality: (3) $C_{\max }+2 \log m / 2$.
Additive factor shrinking!
The 3 can be made $(1+\varepsilon)$ using different base!

## Geometrical view.



Smooth: use $\sum_{e} 2^{c(e)}$ as a proxy for max ${ }_{e} c(e)$.
Minimize new function
Gradient descent.
Stepsize=1. Back and forth!
Stepsize=.5. Back and forth ...but closer to minimum.

