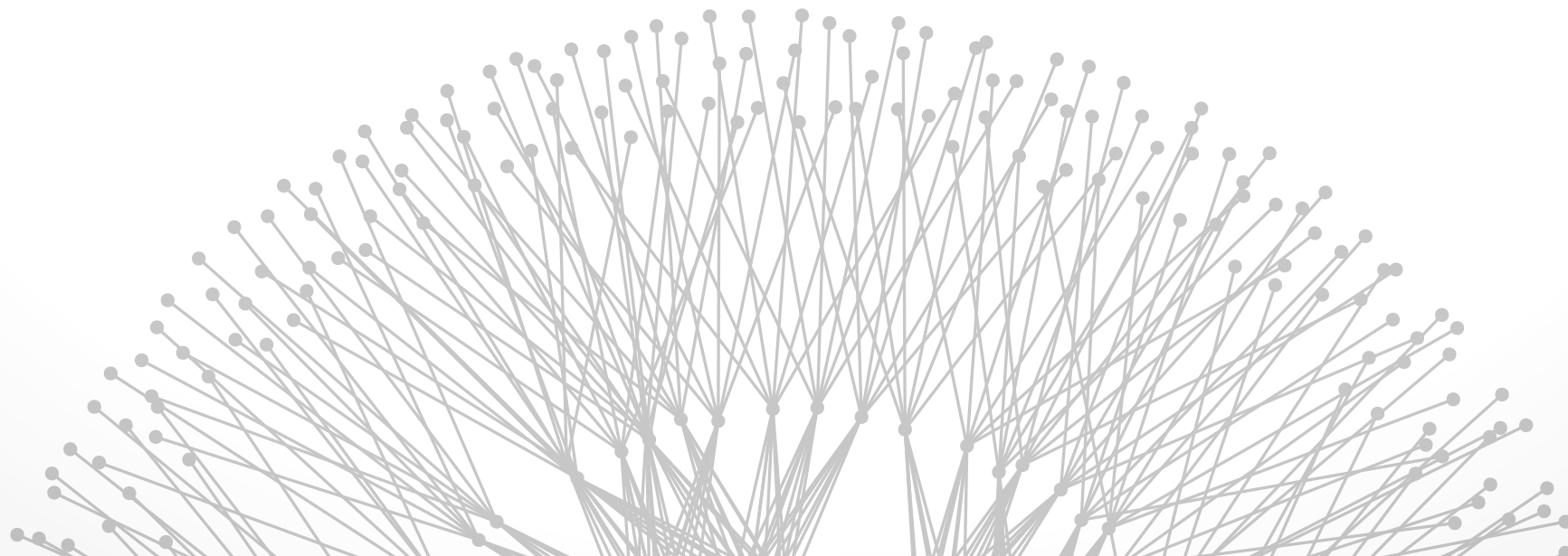


Network Games

Brighten Godfrey
CS 538 October 17 2013



Demo

Game theory basics

Games & networks: a natural fit



Game theory

Studies interaction
between selfish agents

Networking

Enables interaction
between agents

Networks make games happen!



Components defining a game

- Two or more **players**
- Set of **strategies** for each player
- For each combination of played strategies, a **payoff** or utility for each player

Red player strategies

Prisoner's Dilemma

Blue player strategies

	Cooperate	Defect
Cooperate	-1, -1	-12, 0
Defect	0, -12	-5, -5

Nash equilibrium



A chosen strategy for each player such that no player can improve its utility by changing its strategy

- (In **mixed** Nash equilibrium: players randomize their strategies according to some distribution and no player can improve its *expected* utility)

Can you find a Nash equilibrium?

Blue player strategies

Red player strategies

	Cooperate	Defect
Cooperate	-1, -1	-12, 0
Defect	0, -12	-5, -5

Prisoner's dilemma Nash eq.



Blue player strategies

Red player strategies

	Cooperate	Defect
Cooperate	-1, -1	-12, 0
Defect	0, -12	-5, -5

Nash equilibrium

Price of Anarchy



[C. Papadimitriou, "Algorithms, games and the Internet", STOC 2001]

Assumes some global "cost" objective, e.g., social utility (sum of players' payoffs).

Price of anarchy = $\frac{\text{worst Nash equilibria's cost}}{\text{optimal cost}}$

		Blue prisoner	
		Cooperate	Defect
Red prisoner	Cooperate	-1, -1	-10, 0
	Defect	0, -10	-5, -5

Here, $\text{PoA} = 10/2 = 5$.

Rock Paper Scissors



Can you find a Nash equilibrium in R-P-S?

Blue player strategies

		Rock	Paper	Scissors
Red player strategies	Rock	\$0, \$0	\$0, \$1	\$1, \$0
	Paper	\$1, \$0	\$0, \$0	\$0, \$1
	Scissors	\$0, \$1	\$1, \$0	\$0, \$0

No pure Nash equilibrium!



Stable paths problem

- [Tim Griffin, Bruce Shepherd, Gordon Wilfong, ToN'02]
- A game model of BGP

How bad is selfish routing?

- [Tim Roughgarden, Eva Tardos, JACM 2002]
- Analysis of price of anarchy of latency-optimized routing

Selfish routing in Internet-like environments

- [Lili Qiu, Richard Yang, Yin Zhang, Scott Shenker, SIGCOMM'03]
- What is the price of anarchy like in practice for latency-optimized routing?

Internet routing as a game

BGP routing as a game

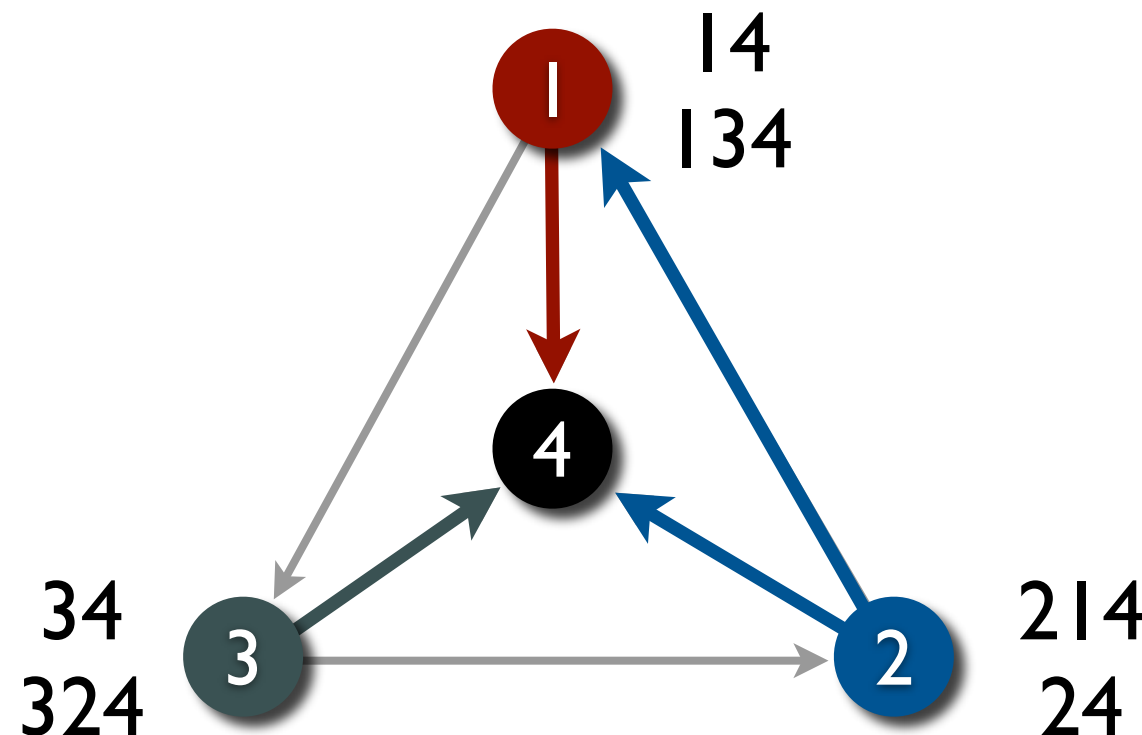
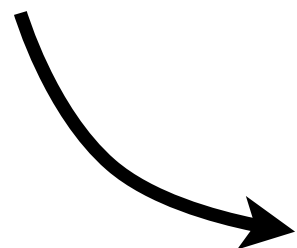


players autonomous systems

strategies pick a route, any route... (to fixed dest.)

player's utility arbitrary function of route (but $-\infty$ for 'illegal' route not offered by neighbor)

Routes in order of preference for this AS



BGP routing as a game

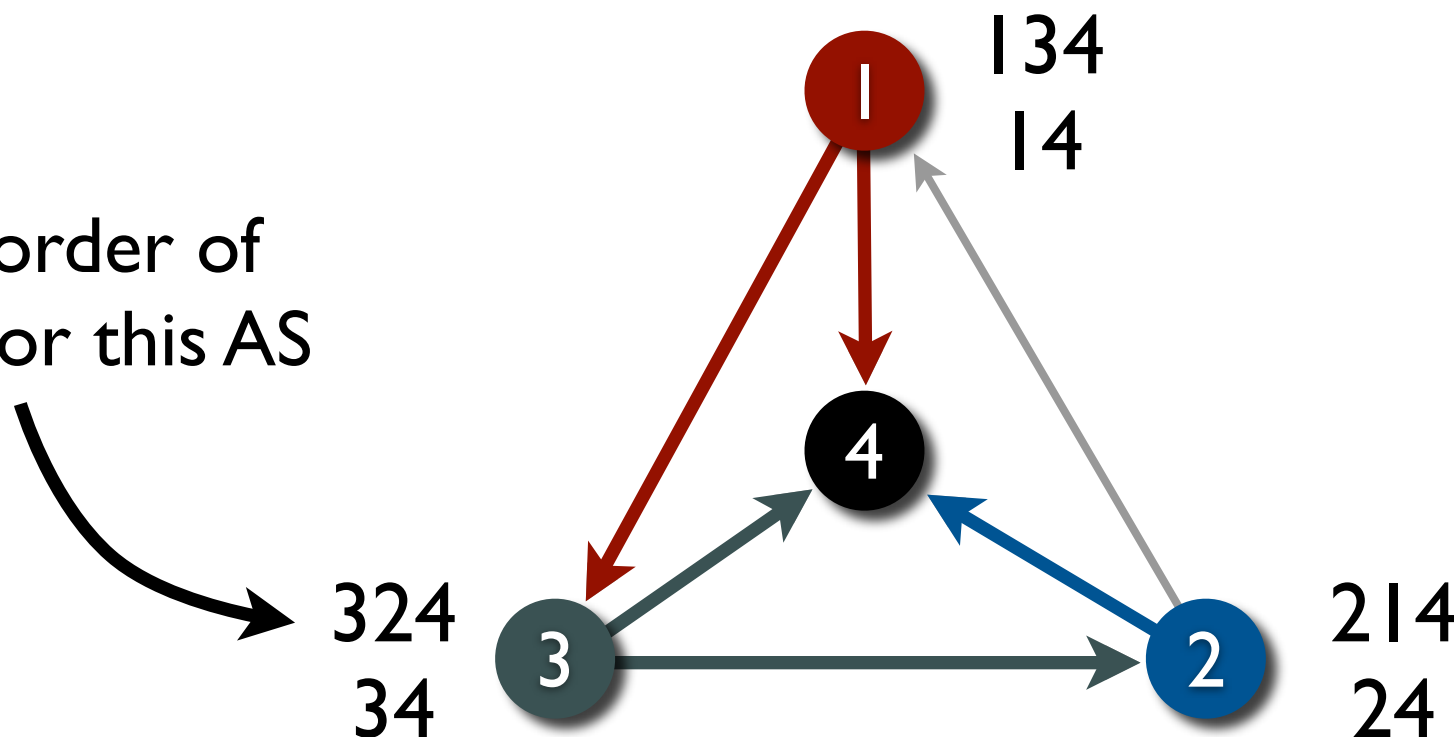


players autonomous systems

strategies pick a route, any route... (to fixed dest.)

player's utility arbitrary function of route (but $-\infty$ for 'illegal' route not offered by neighbor)

Routes in order of preference for this AS



No Nash equilibrium!

BGP routing as a game



In general, NP-complete to decide whether an equilibrium exists [Griffin, Shepherd, Wilfong, ToN'02]

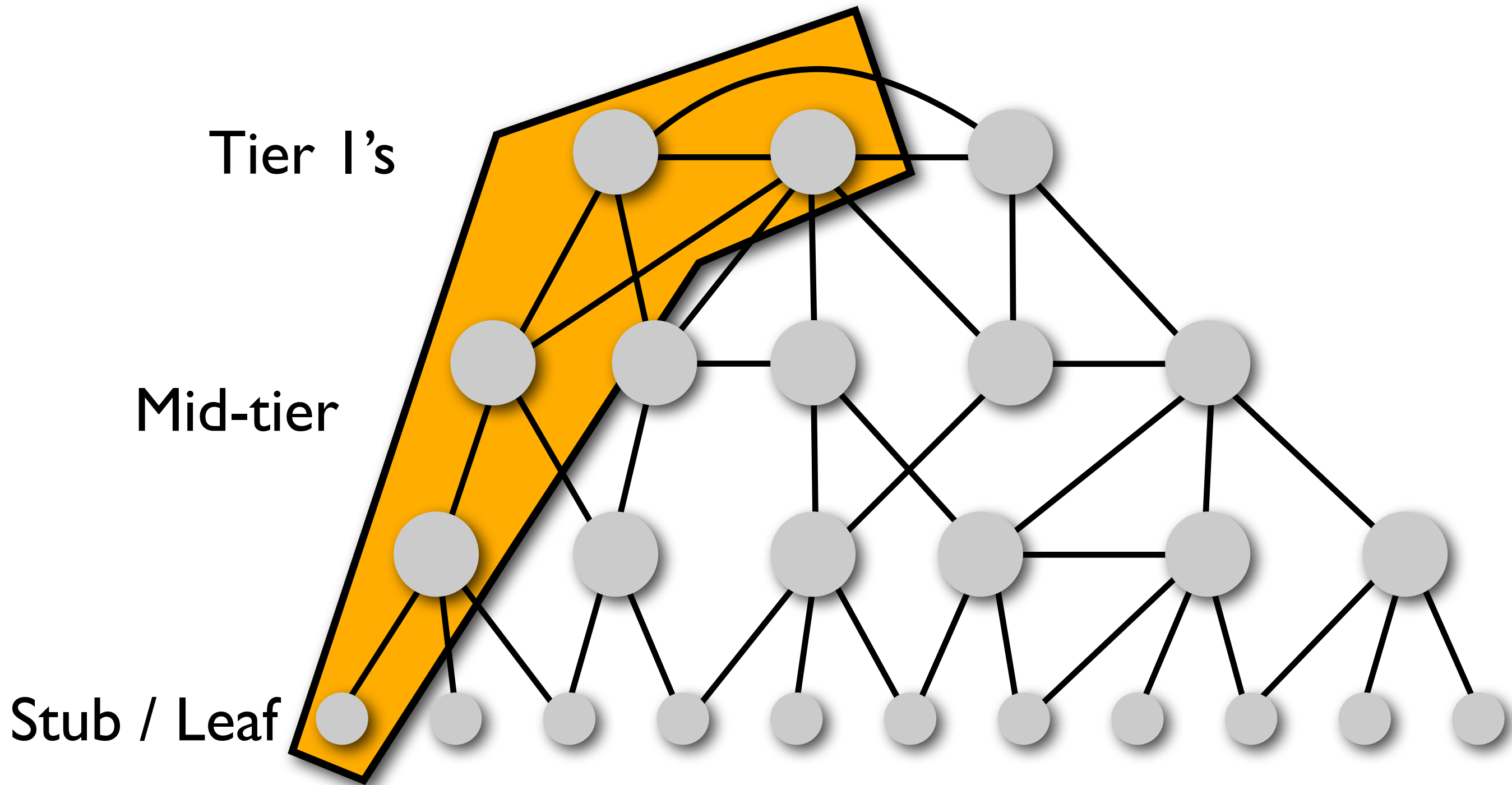
Might have 0, 1, 2, 3, ... equilibria

Even if it has an equilibrium, might not converge to it

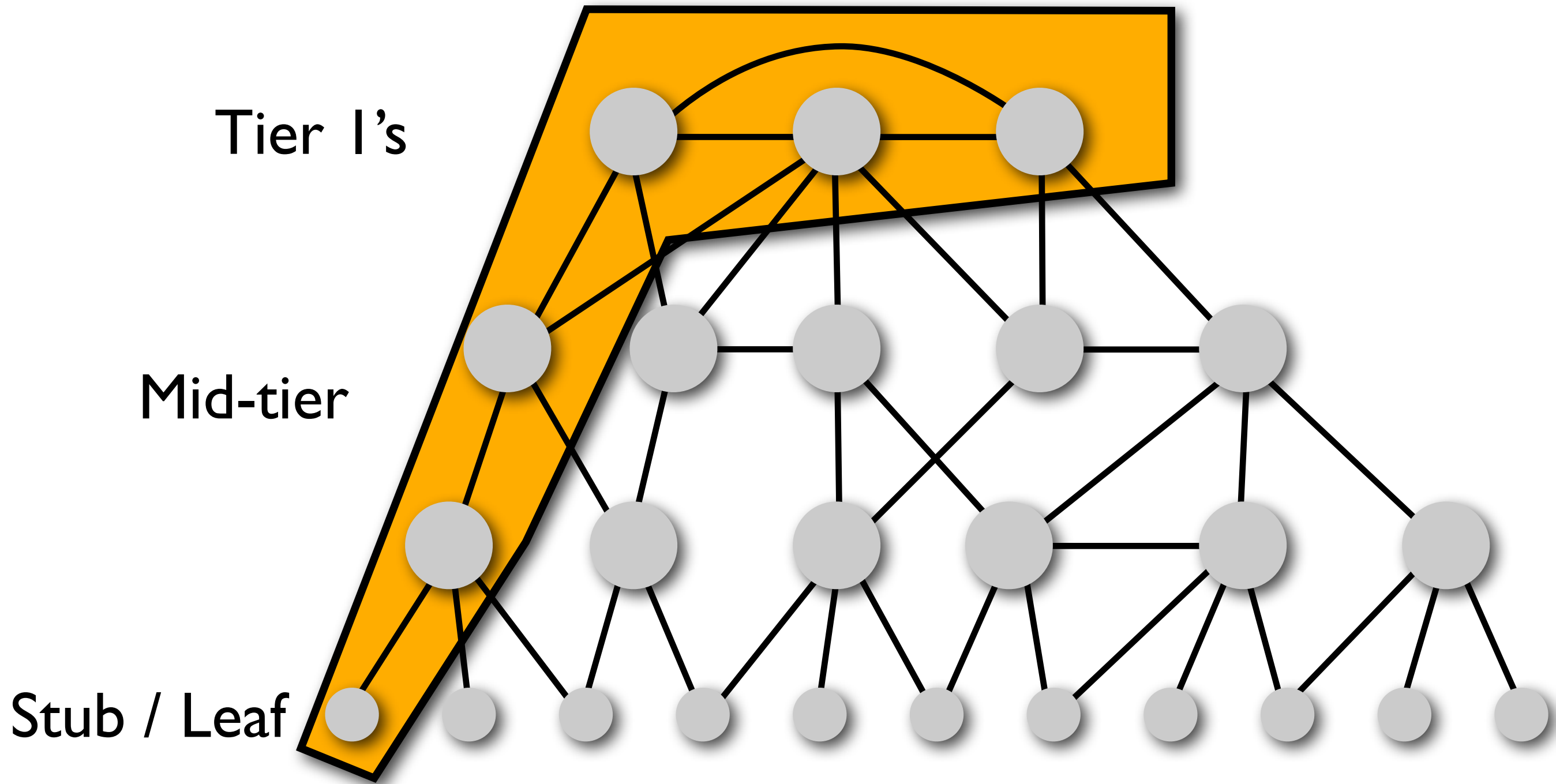
- Depends on starting state, message timing, ...
- PSPACE-complete to decide whether a given set of BGP preferences can oscillate [Fabrikant, Papadimitriou, SODA'08]

If we assume customer-provider-peer and valley-free routing, guaranteed to converge [Gao, Rexford]

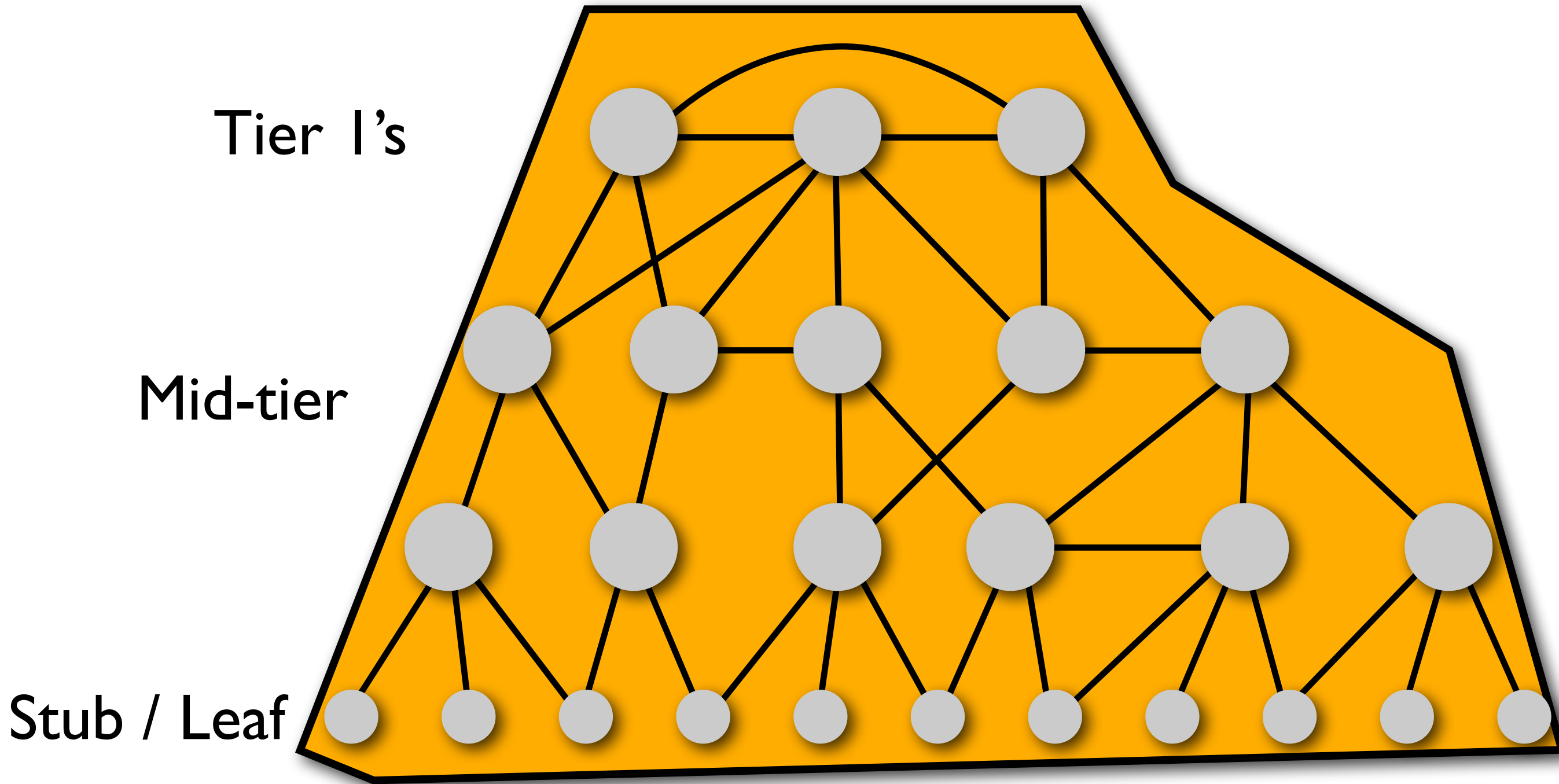
Gao-Rexford convergence



Gao-Rexford convergence



Gao-Rexford convergence



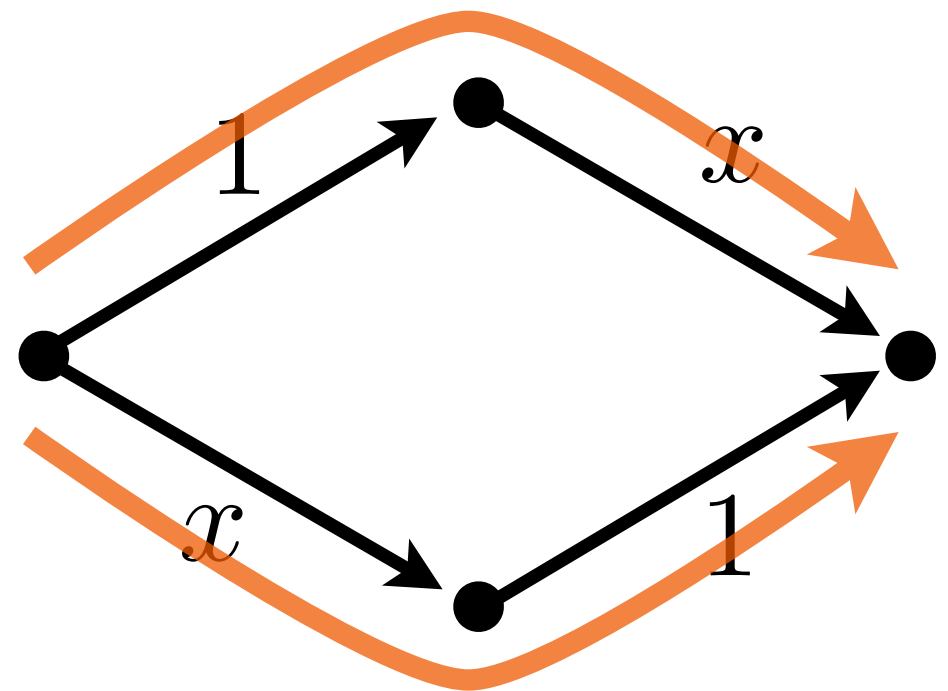
How bad is
selfish routing?

The selfish routing game



The game context:

- Directed graph
- **Latency function** on each edge specifying latency as function of total flow x on edge
- **Path latency** = sum of edge latencies



Flow $x = 0.5$ on each path;
Total latency = 1.5

The selfish routing game

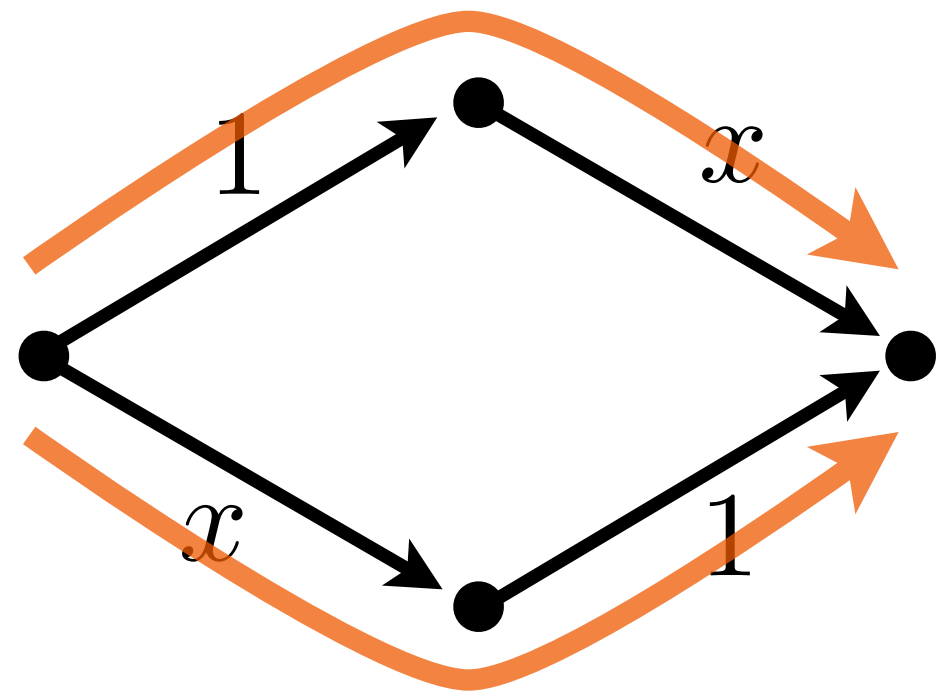


Player strategy:

- Pick a path on which to route
- Players selfishly pick paths with lowest latency (source-controlled routing)

For now assume:

- many users
- each has negligible load
- total load = 1

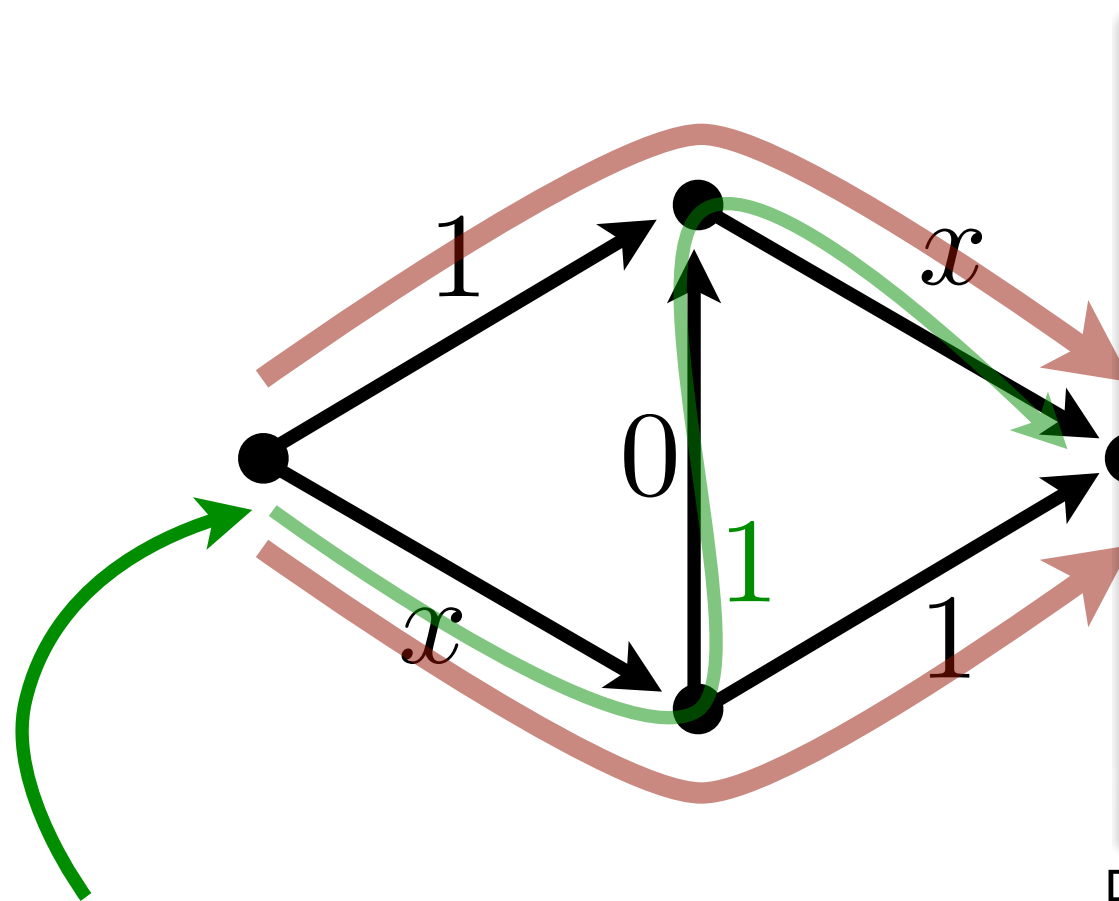


Flow $x = 0.5$ on each path;
Total latency = 1.5

Example: Braess's paradox



[Dietrich Braess, 1968]



*Green path is better.
Everyone switches to it!*

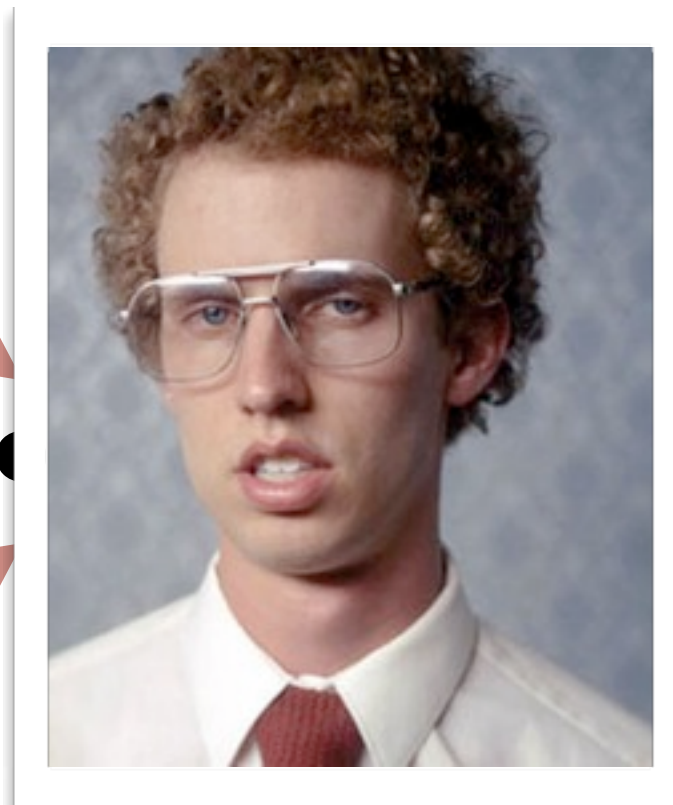


Fig 1 b: N. Dynamite.

\approx

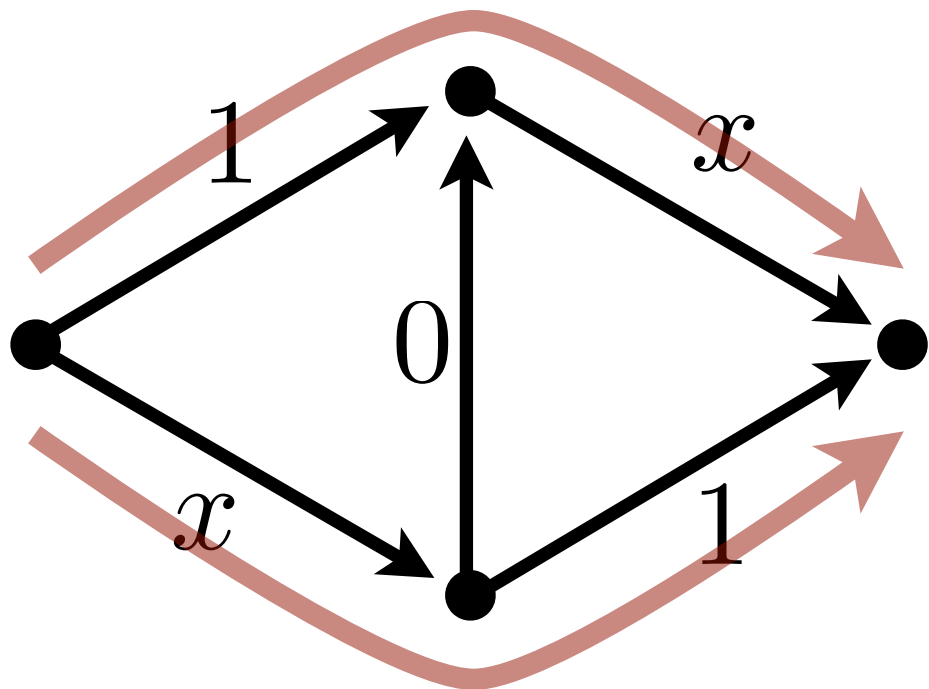


Fig 1 a: D. Braess.

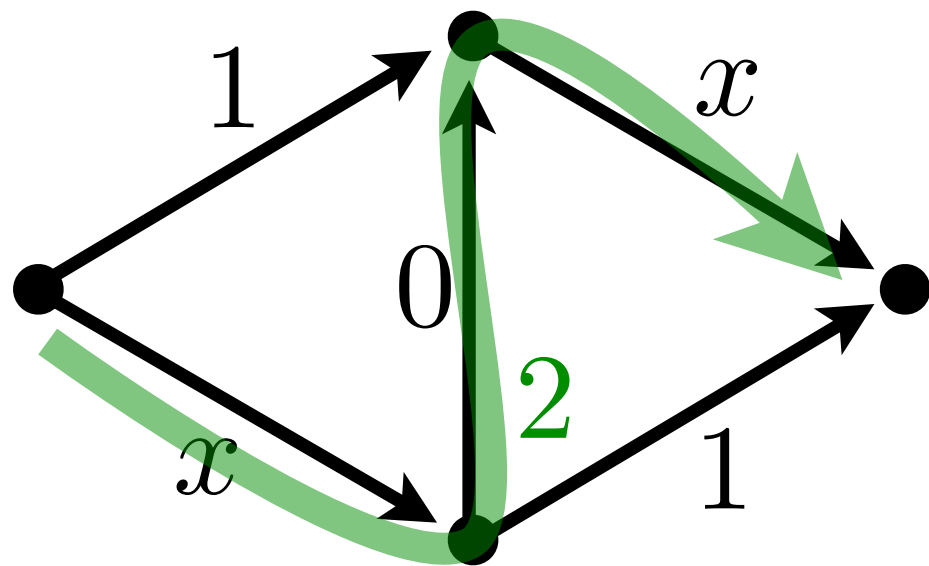
Initially: 0.5 flow along each path; latency $1 + 0.5 = 1.5$

With new edge: all flow along greed path; latency = 2

Example: Braess's paradox



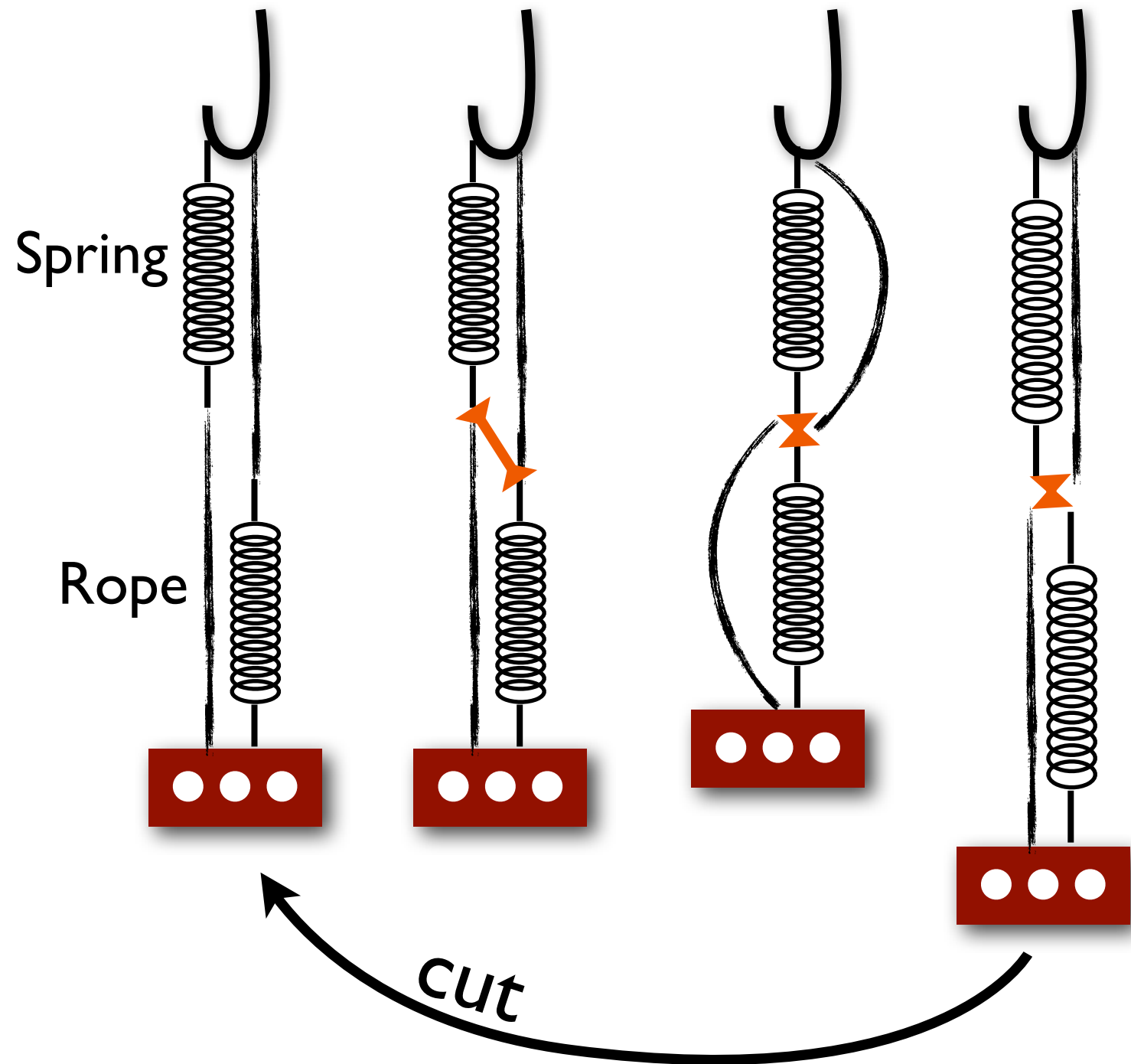
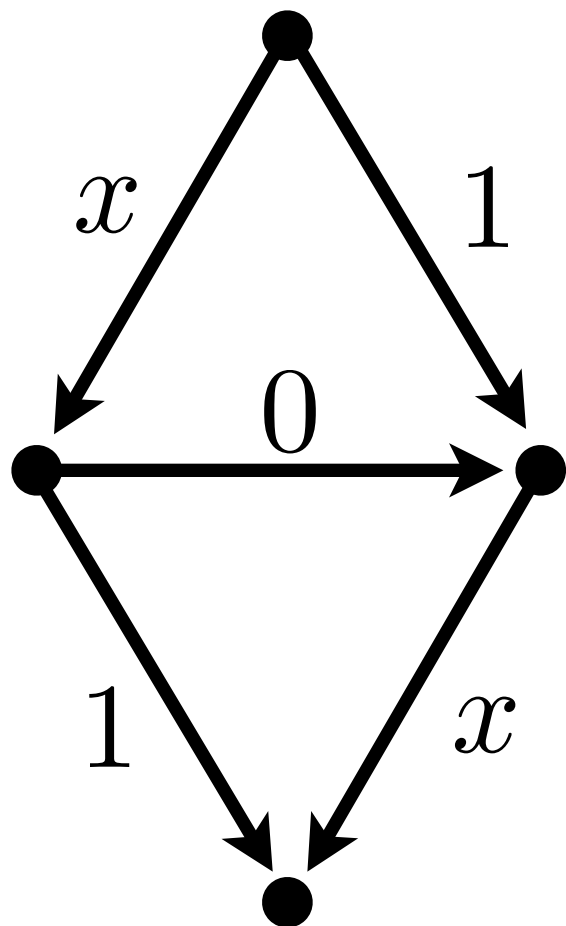
Optimal latency = 1.5



Nash equilibrium latency = 2

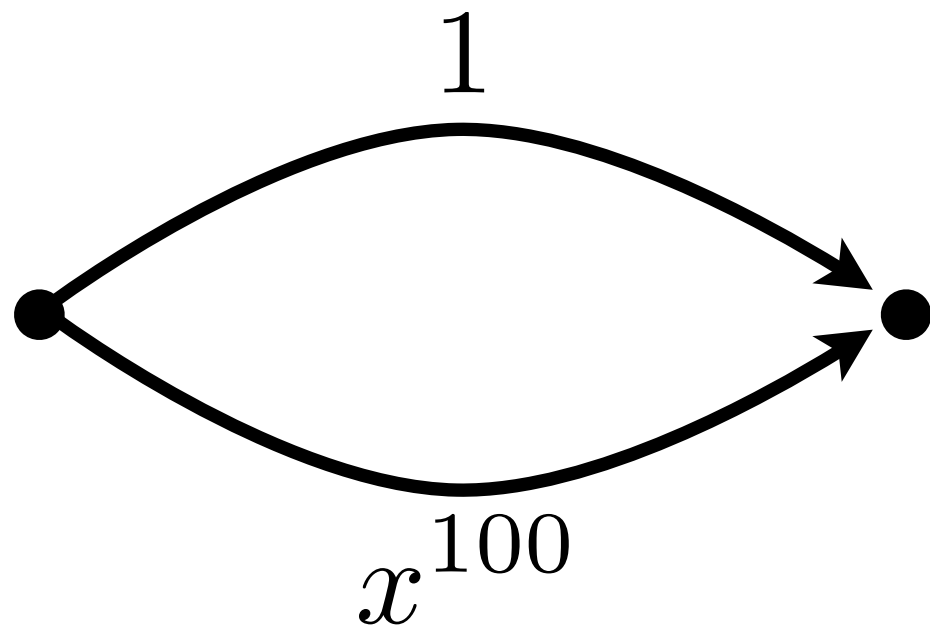
Thus, price of anarchy = $4/3$

From links to springs

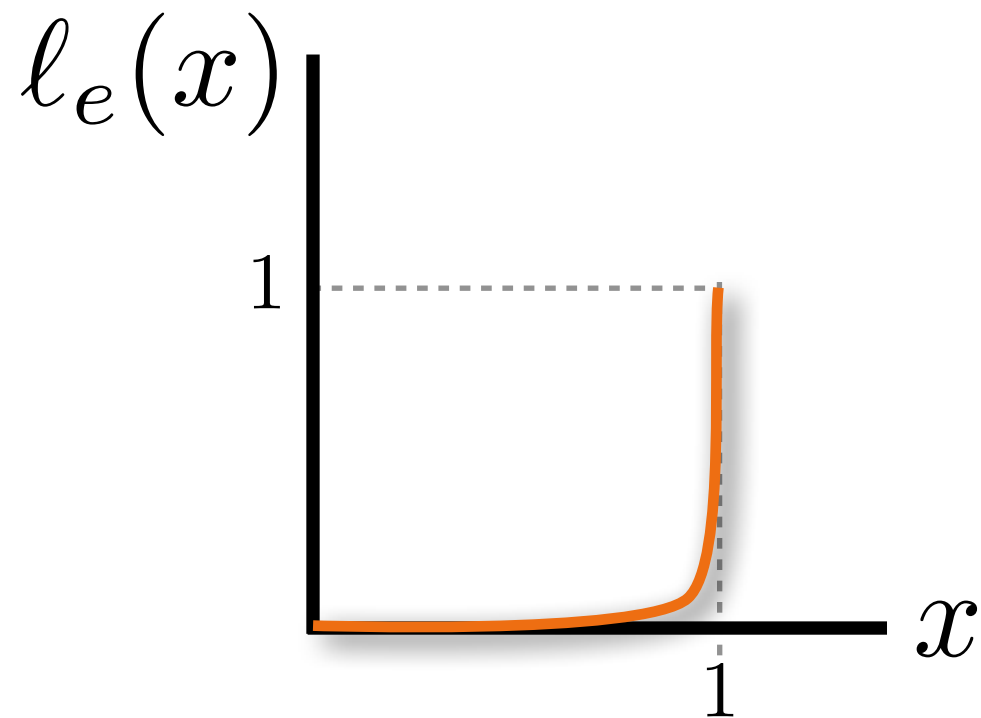


[Cohen and Horowitz, Nature 352, 699 - 701 (22 August 1991)]

Example: arbitrarily bad



Optimal: **almost** all flow on bottom; total latency near zero



Nash: all flow on bottom;
total latency = 1



As we just saw, price of anarchy can be arbitrarily high

But for linear latency functions: $\text{PoA} \leq 4/3$

For any latency function: Nash cost is at most optimal cost of $2x$ as much flow

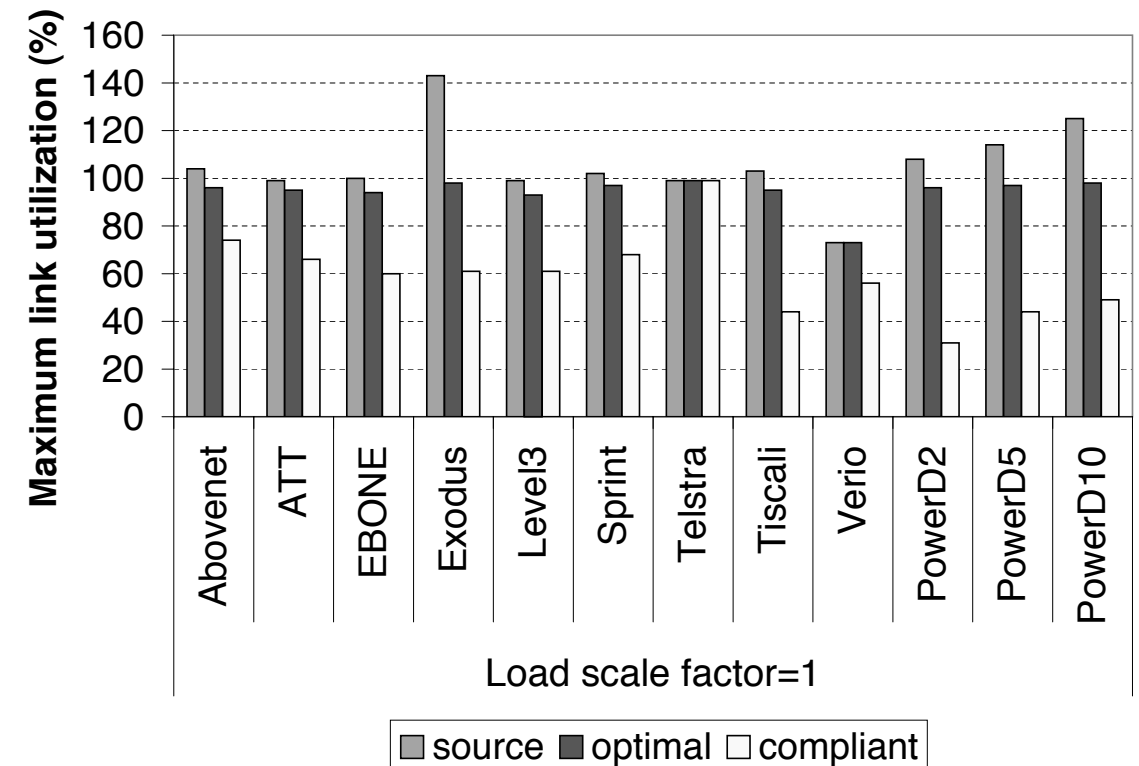
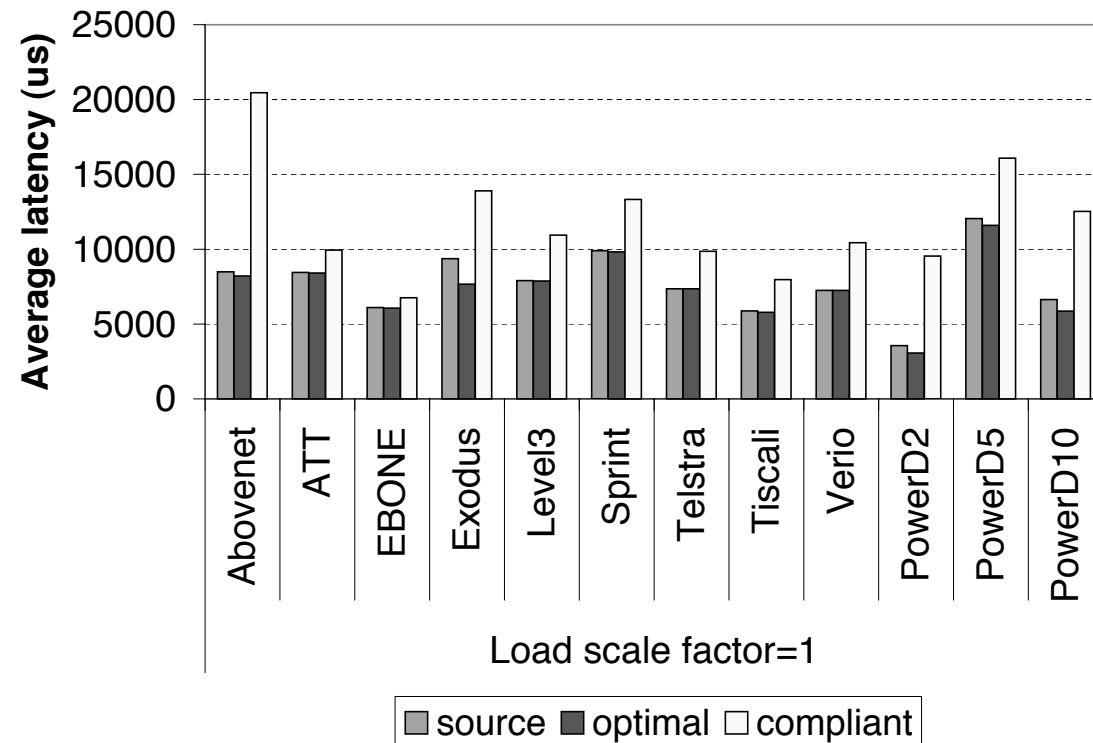
Extension to finitely many agents

- i.e., a single agent might have a nontrivial fraction of the total bandwidth
- Splittable flow: similar “ $2x$ ” result
- Unsplittable flow: can be very bad

Selfish routing in realistic networks



[Qiu et al., SIGCOMM 2003]



Close to optimal latency

...but higher maximum link utilization



Max utilization is higher in selfish. Does it matter?

[Zhuotao]

Is average latency the right objective for the user?

[Sangeetha, Siyu]



How would the traffic engineering systems we learned about earlier interact with this framework?

[Anthony]

- Suppose the network is running a near-optimal TE underneath selfish overlay routing. Would the overlay end up doing anything nontrivial?



What would results be as a function of percentage of nodes being selfish? [Nirupam]



Game theory used in networking to model

- Equilibria of distributed algorithms
- ISPs competing with each other
- Spread of new technology in social networks
- ...

Many more applications of game theory to CS

- ...and applications of CS to game theory!
- See Nisan, Roughgarden, Tardos, Vazirani's book [Algorithmic Game Theory](#), available free online



Next Tuesday

- Survey of BGP security Issues (Butler, 2010)

Projects

- By now you should be moving along and have some initial progress
- Midterm presentations in less than 3 weeks
- Benchmark: demonstrate concrete progress