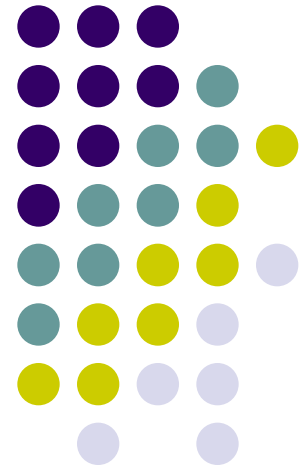


# How much Can Taxes Help Selfish Routing

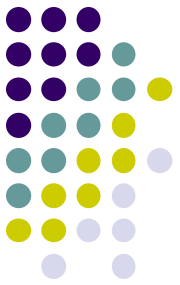
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Ακαδημαϊκό Έτος 2010-2011

Παπαλεξίδης Νίκος

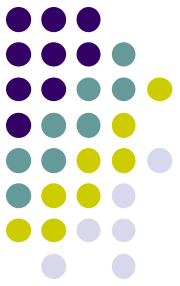


# Introduction

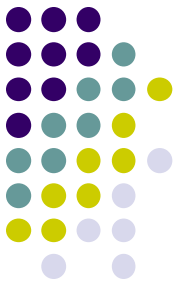


- Selfish behavior in networks
- Nash equilibrium
- Pricing network edges – impose taxes
- Total cost (disutility) : Latency + Taxes
- Benefits of taxes on networks and complexity of computing optimal taxes

# Nash equilibrium - flows

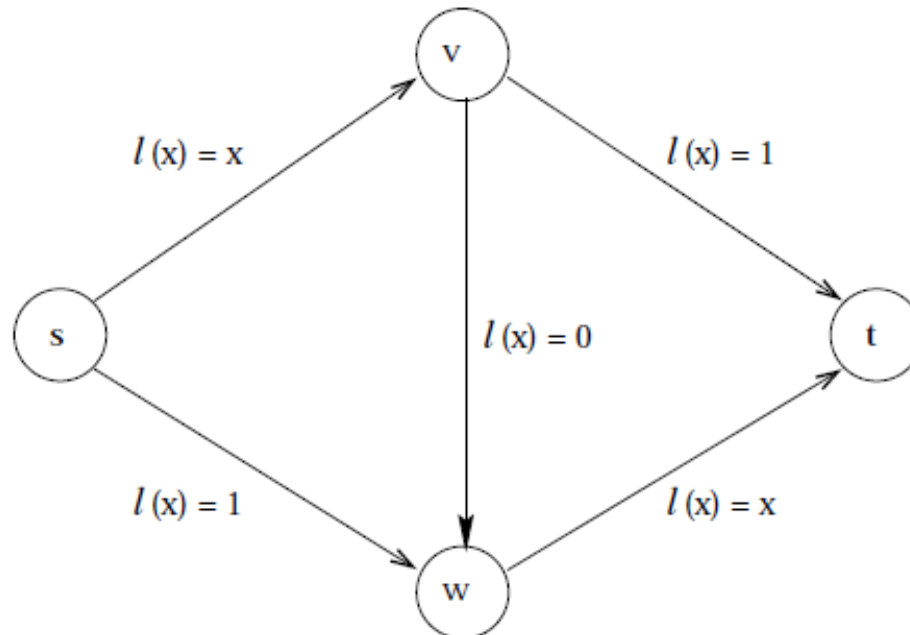


- Selfish routing – Each user routes itself on minimum-latency path, given the network congestion due to other users
- Nash equilibrium : Stable point in which no user has an incentive to unilaterally alter its strategy
- Nash flow : All traffic is routed on paths with minimum-possible latency
- Nash equilibrium is not optimal : Latency is not minimized
- Marginal taxes
- Total cost = Latency + Taxes

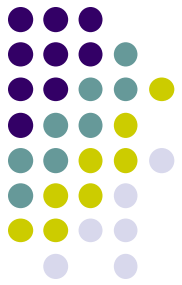


# Routing model

- Traffic from source  $s$  to sink  $t$  in a graph  $G(V,E)$
- Latency function  $l_e(f)$  for each edge  $e$  (function of the flow  $f$ )
- Example :

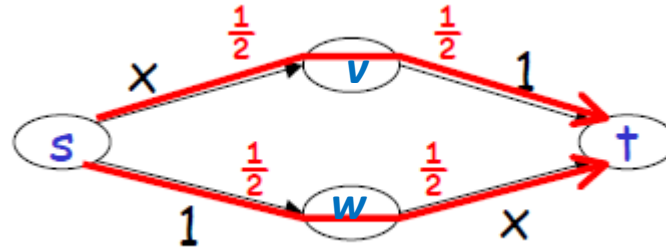


# Braess paradox



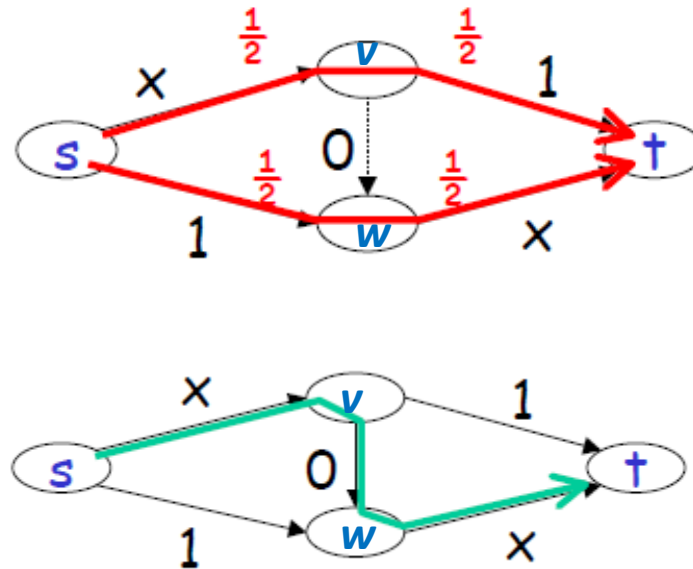
Initial network

delay = 1.5

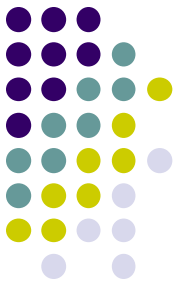


Extra edge  $v-w$   
added

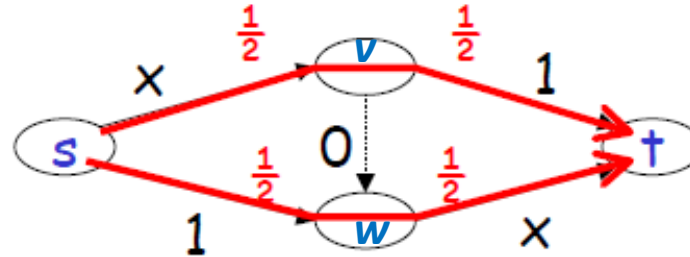
delay = 2.0



# Improve situation with taxes



Tax =  $\frac{1}{2}$  on edge  $v-w$   
delay = 1.5  
tax + delay = 1.5

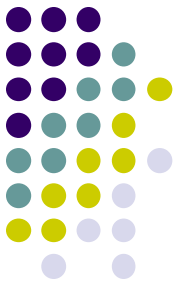


Result :

No taxes paid

Latency improved (1.5 from 2.0)

Total cost = Latency + Taxes



# Marginal taxes

**Marginal cost pricing** : Each user should pay a tax equal to the additional delay other users experience because of his presence

Marginal taxes on edges

$s-v$  and  $x-t$  are  $\frac{1}{2}$  and  $0$  on other edges

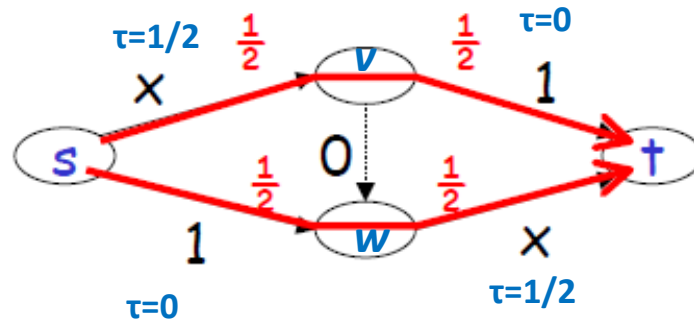
delay = 1.5

**but :**

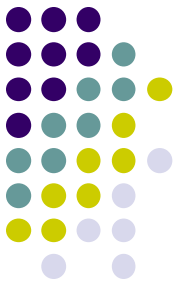
tax + delay = 2.0

Latency improved

Total cost did not improve

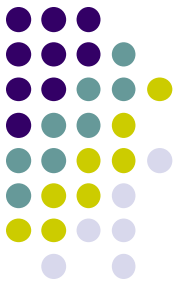


# Problem - Questions



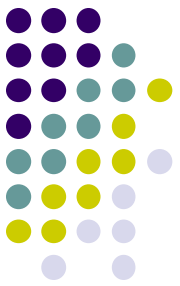
- Goal : Decrease the total cost (Latency + Taxes) using taxes
- Questions studied :
  - Are marginal taxes a good idea for minimizing Nash equilibrium?
  - Compare the efficiency of taxes with that of edge removal (note that a large edge tax removes the edge from the network)
  - Compute or approximate efficiently the optimal taxes





# Model - definitions

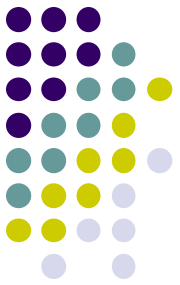
- Simple Path  $P$  from  $s$  to  $t$
- Flow  $f_p$  on each path  $P$
- Flow  $f_e$  on edge  $e$
- $r$  : traffic rate
- $l_e(f_e)$  : latency function on edge  $e$
- $l_p(f)$  : latency of a path  $P$  with respect to flow  $f$
- $L(f)$  : total latency 
$$L(f) \equiv \sum_P l_P(f) f_P = \sum_{e \in E} l_e(f_e) f_e$$
- Optimal or minimum-latency flow : minimizing  $L(f)$
- $\tau_e$  : tax on edge  $e$
- $\tau_p$  : total taxes on a path  $P$
- $C(f, \tau)$  : Cost of a flow  $f$  (Latency + Taxes) 
$$C(f, \tau) \equiv \sum_P [l_P(f) + \tau_P] f_P = \sum_{e \in E} [l_e(f_e) + \tau_e] f_e$$
- $(G, r, l)$  instance of  $G$
- $(G, r, l + \tau)$  : instance with taxes



# Flows at Nash equilibrium

- Proposition (2.6) : If  $f$  is at Nash equilibrium for  $(G, r, l + \tau)$ , then there is a constant  $c \geq 0$  with  $l_p(f) + \tau_p = c$ . Moreover  $C(f, \tau) = r \cdot c$  (all paths have the same latency + tax)
- Marginal tax  $\tau_e$  :
$$\tau_e = f_e \cdot l'_e(f_e)$$
- **Proposition (3.1)** :  $(G, r, l)$  instance with latency function admitting minimum-latency flow  $f^*$ . If  $\tau_e$  is marginal cost tax for edge  $e$ ,  $f^*$  is at Nash equilibrium for  $(G, r, l + \tau)$ 

Meaning : Marginal taxes induce the minimum-latency flow as a flow at Nash equilibrium
- Effective way to minimize the total latency of a Nash flow with edge taxes
- How effective are marginal taxes if we account the total cost (latency + taxes)?



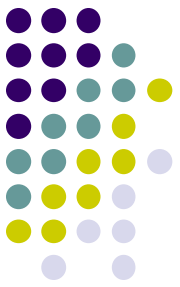
# When do marginal costs help?

- Theorem 3.2 :  $(G, r, l)$  instance with linear latency function. Let  $f$  and  $f^\tau$  be Nash flows for  $(G, r, l)$  and  $(G, r, l + \tau)$  respectively.

$$\text{Then } C(f, 0) \leq C(f^\tau, \tau)$$

- Meaning : Linear marginal taxes can not improve total cost
- Same result for latency function  $\alpha_e x^p + b_e$  with  $\alpha_e, b_e \geq 0$  (fixed  $p$ )

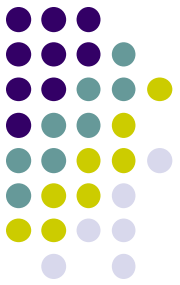
# Effectiveness of arbitrary taxes – Upper bounds



- *Price of anarchy (PA)*: Largest possible ratio between the total latency of a Nash flow and that of a minimum latency flow.
- Can be used as upper bound of the maximum-possible reduction in cost due to taxes.
- Prop. 4.1 : Linear latency functions,  $PA=4/3$  (see example Braess Paradox)
- Prop. 4.2 : Latency functions polynomial with degree at most  $p$ ,  $PA \rightarrow \Theta(p/\log p)$
- Theorem 4.5 :  $(G,r,l)$  and  $(G,r,l+\tau)$  instances with  $f$  and  $f^\tau$  Nash flows respectively. Then

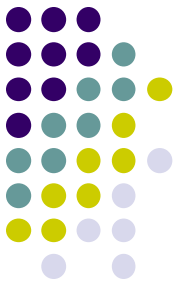
$$L(f) \leq \left\lceil \frac{n}{2} \right\rceil \cdot C(f^\tau, \tau)$$

# Comparing Taxes with Edge Removal



- Networks with linear latency functions
  - Theorem 5.1 : An instance with linear latency functions admits an optimal set of taxes that is  $0/\infty$
- Meaning :
- Taxes in linear latency networks are equivalent with edge removal with respect to the maximum reduction of the Nash flow (=  $4/3$ )
  - Taxes in these networks can not improve the Nash flow more than the removal of some edges

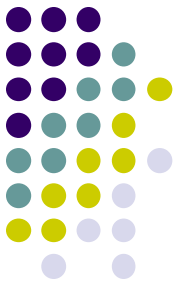
# Comparing Taxes with Edge Removal



- Networks with general latency functions
- Theorem 5.2 : For each integer  $n \geq 2$ , there is an instance  $(G, r, l)$  with  $c(H, r, l) = \left\lfloor \frac{n}{2} \right\rfloor$  for all subgraphs  $H$  of  $G$  but  $c(H, r, l + \tau) = 1$  for some tax  $\tau \geq 0$ .

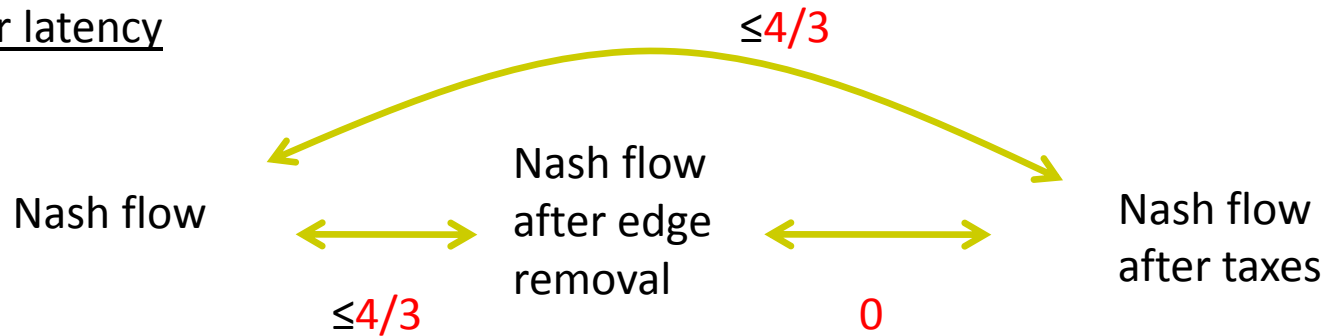
Meaning : - Taxes in general latency networks can improve the Nash flow by a  $\left\lfloor \frac{n}{2} \right\rfloor$  factor beyond what is achievable by removing edges.

- Removing edges can improve the Nash flow by a  $\left\lfloor \frac{n}{2} \right\rfloor$  factor ([1])
- Combined taxes+edge removal cannot improve more than  $\left\lfloor \frac{n}{2} \right\rfloor$  (due to Theorem 4.5)

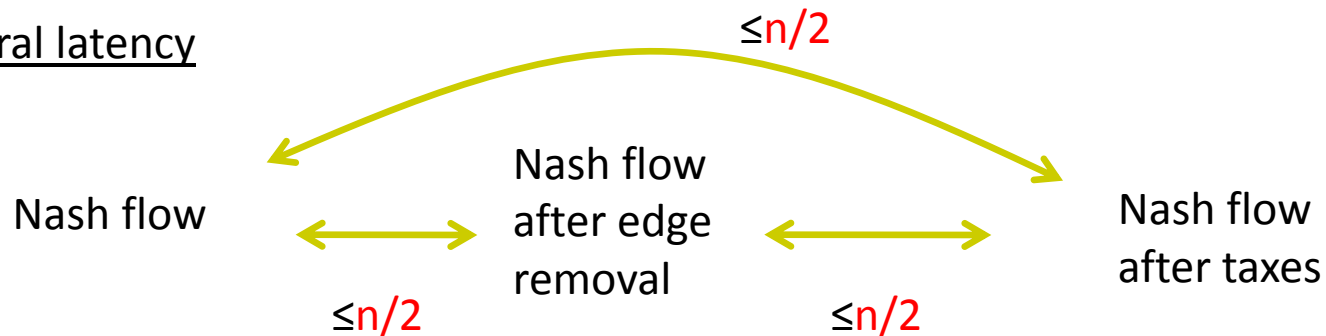


# Comparing Taxes with Edge Removal

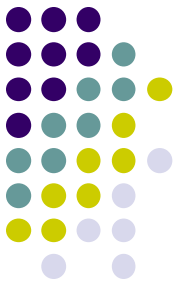
## Linear latency



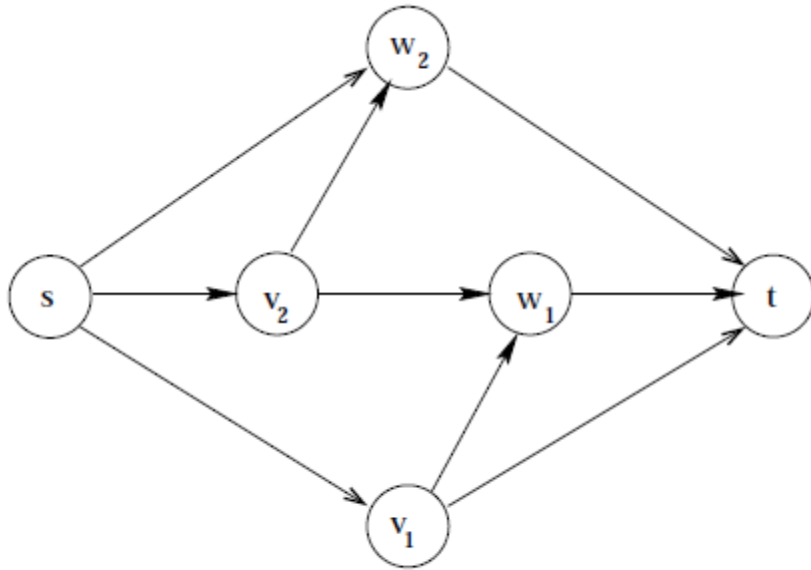
## General latency



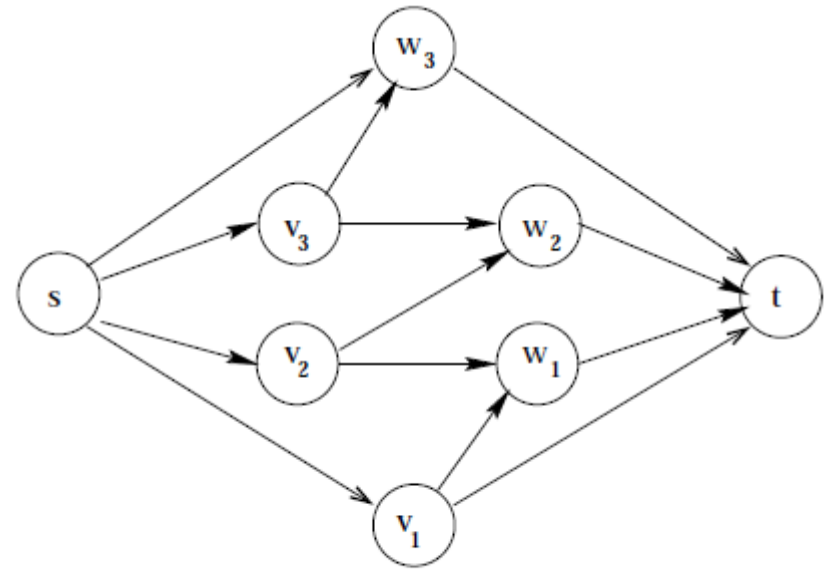
# Comparing Taxes with Edge Removal



- Examples : Braess Graphs



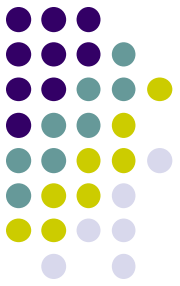
(a)  $B^2$



(b)  $B^3$



# Complexity of Computing Optimal Taxes

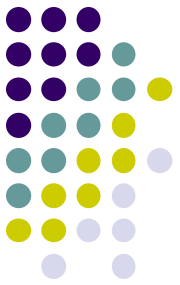


Trivial algorithm : Assign all edges zero taxes

Approximation factor

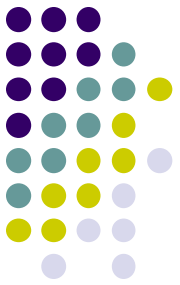
- Linear latency :  $4/3$
- Polynomial latency functions with degree  $p$  :  $\Theta(p/\log p)$
- General latency functions :  $\left\lceil \frac{n}{2} \right\rceil$
- Theorem 6.2 : Unless  $P=NP$ , ( $\epsilon>0$ ), the problem of computing optimal taxes has no approximation algorithm with factor
  - $(4/3-\epsilon)$  for linear latency networks
  - $o(p/\log p)$  for polynomial with degree  $p$  networks
  - $O(n^{1-\epsilon})$  for general networks

# Conclusion



Problem Studied	Linear Latency function	General latency function
Can marginal taxes help?	No	Yes
Maximum benefit of taxes	$4/3$	$n/2$
Taxes better than network design (edge removal)	No	Yes
Approximability of optimal taxes	$4/3$	$O(n^{1-\epsilon})$

# References



- [1] T. Roughgarden. Designing networks for selfish users is hard. In *Proceedings of the 42<sup>nd</sup> Annual Symposium on Foundations of Computer Science*, pages 472–481, 2001.
- [2] T. Roughgarden and E. Tardos. How bad is selfish routing? *Journal of the ACM*, 49(2):236–259, 2002. Preliminary version in *FOCS '00*.
- [3] R.Cole, Y.Dodis and T.Roughgarden. How Much Can Taxes Help Selfish Routing? EC '03, pages 98-107.