

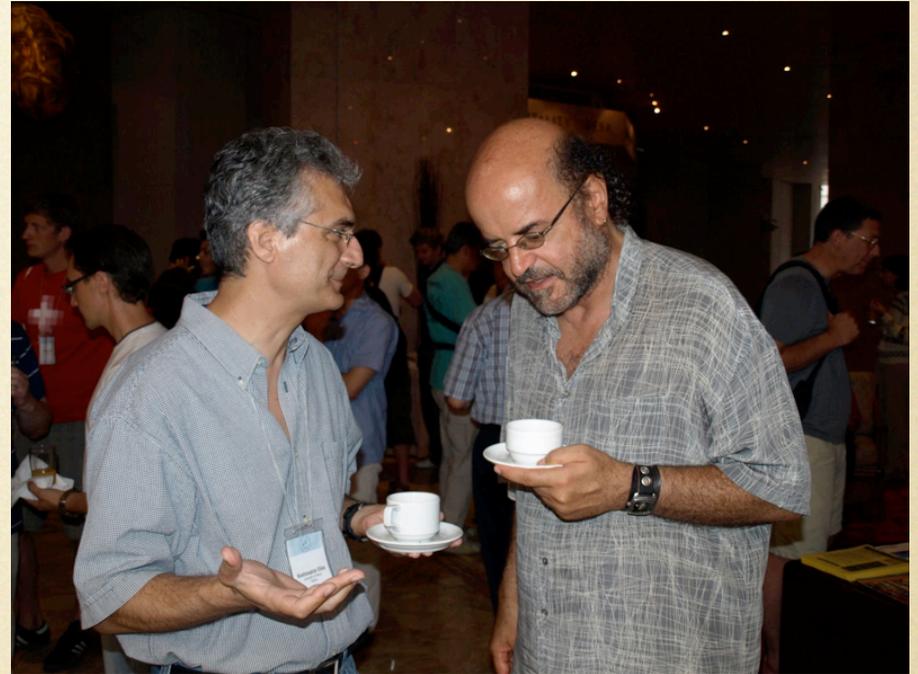
# Fear in Mediation

Jared Saia

(Joint with J. Diaz, D. Mitsche, N. Rustagi)

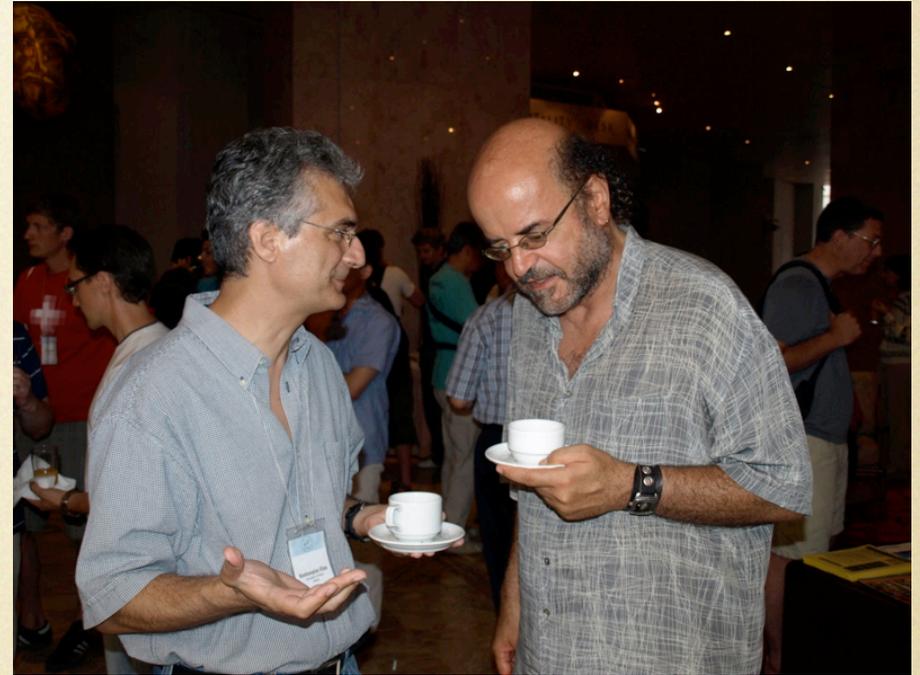
# Price of Anarchy(POA)

- Social Welfare (SW) = Sum of utilities of all agents
- In most games, SW with selfish players is worse than SW with benevolent dictator
- POA measures that difference

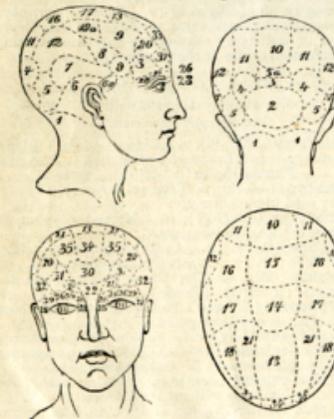


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**Phre-nol'o-gy** (-nôl'ô-jî), *n.* [Gr. φρήν, φρενός + *-logy*.] 1. Science of the special functions of the several parts of the brain, or of the supposed connection between the faculties of the mind and organs in the brain. 2. Physiological hypothesis that mental faculties, and traits of character, are shown on the surface of the head or skull; craniology. — **Phre-nol'o-gist**, *n.* — **Phren-o-log'ic** (frên'ô-lôj'ik), **Phren'o-log'ic-al**, *a.*



# POA (KP '99)

$$POA = \frac{\text{SW in Worst Equilibria}}{\text{SW with Benevolent Dictator}}$$

- Intuitively, gives quantitative measure of the “tragedy of the commons” effect for a game

# 733 Cites Later

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- POA can vary widely from one game to the other
- But there are many, many games with high POA
- Problem: Everybody talks about POA, but nobody does anything about it!

# Mediator



- Mediator privately suggests an action to each player
- Players can ignore suggestions of mediator; they retain free-will and remain selfish
- Goal: Use mediator to improve SW

# Outline

- Multi round game
- Digression on mediators
- Single round mediator
- Single round impossibility result
- Conclusion and open problems

# A Bandwidth Game

- $n$  players; 1 channel
- each player decides whether or not to transmit on the channel
- If exactly 1 player transmits, their utility is 1
- Otherwise each player that transmits has utility of  $\alpha$
- Price of Anarchy:  $1/\alpha n$

# Multi-round BW

- Each player chooses an action
- Utilities are calculated and actions of players are all revealed
- Continue for another round with probability  $1-p$
- Price of Anarchy:  $1/\alpha n$

# BW Mediator

- Select a player  $x$  randomly; tell  $x$  to send on the channel and all other players to not send on channel
- If any player ever disregards advice, from that round on tell all players to send on channel

# BW Mediator

- If a player disregards mediators advice  
expected utility is:  $(1 + 1/p)\alpha$
- If player follows mediator advice, expected  
utility is  $1/pn$
- Players will follow mediator if  $p \leq 1/(n\alpha) - 1$

# Generalization

- Simple strategy: Let  $H$  be the configuration with the highest Social Welfare and let  $L$  be the configuration with the lowest S.W.
- Mediator tells players to perform actions as in  $H$  until some player disregards and then tell all players to follow  $L$
- Works (minimizes  $p$ ) if all players have same utility in  $H$  and also in  $L$

# Generalization

- What about for general multiround games or for general classes of multiround games???
- In general want to find a mediator that 1) optimizes S.W. and 2) works for the smallest value  $p$  possible
- These are open problems!

# Mediator Digression

- Correlated Equilibria: A probability distribution over strategy vectors that ensures no player has incentive to deviate
- Correlated equilibria: players share a global coin; Nash equilibria: private coins only
- A mediator implements a correlated equilibria

# Mediator?

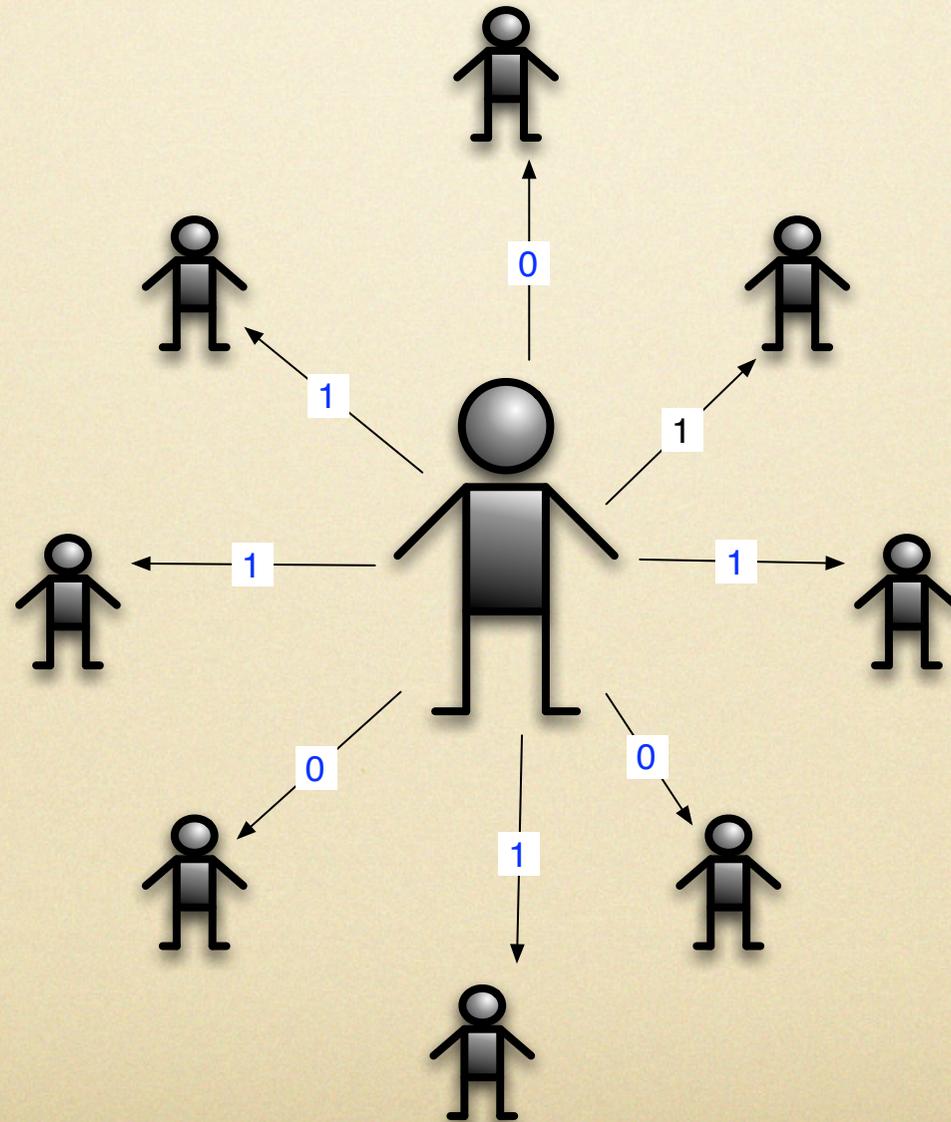
- Is there really ever a trusted third party?

# Mediator?

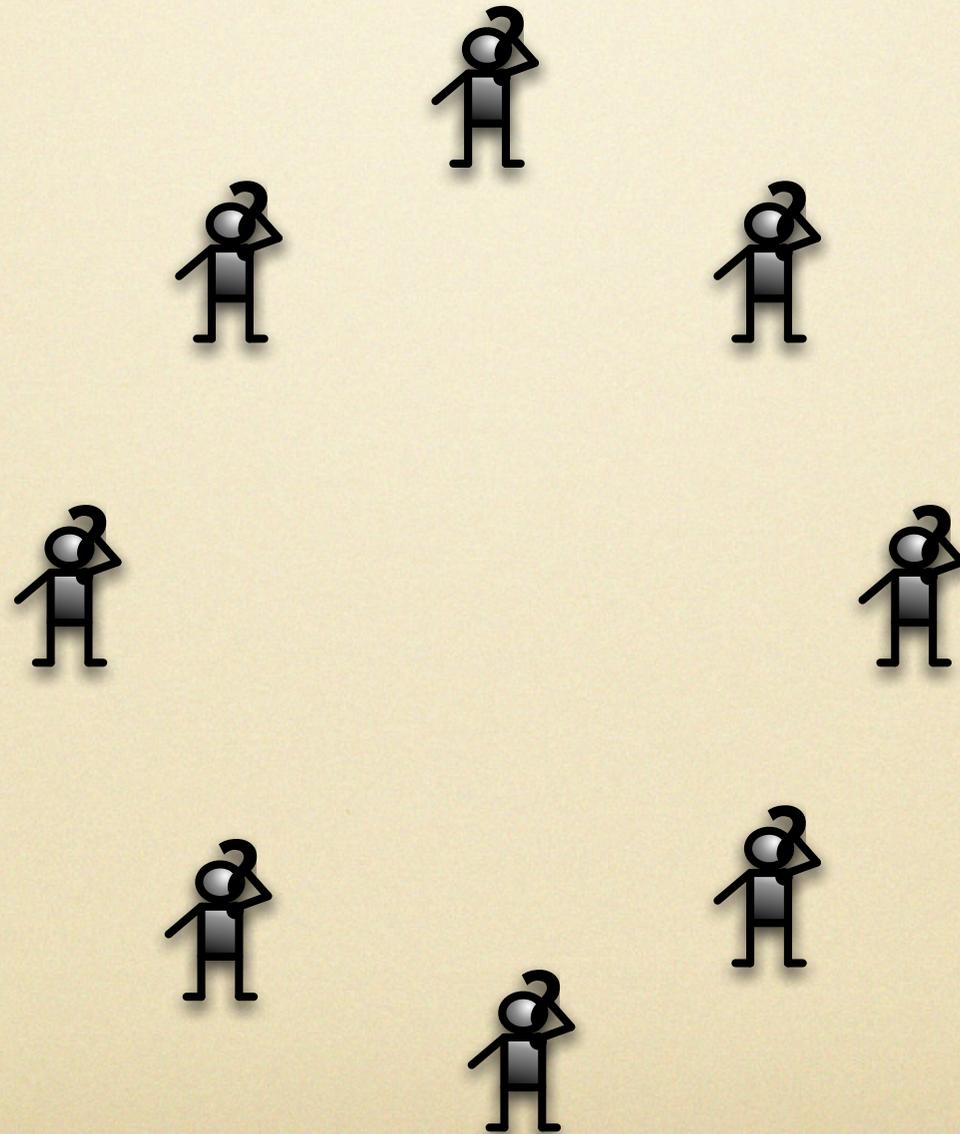
- Is there really ever a trusted third party?

“It is the final proof of God's omnipotence that he need not exist in order to save us.” - Peter De Vries

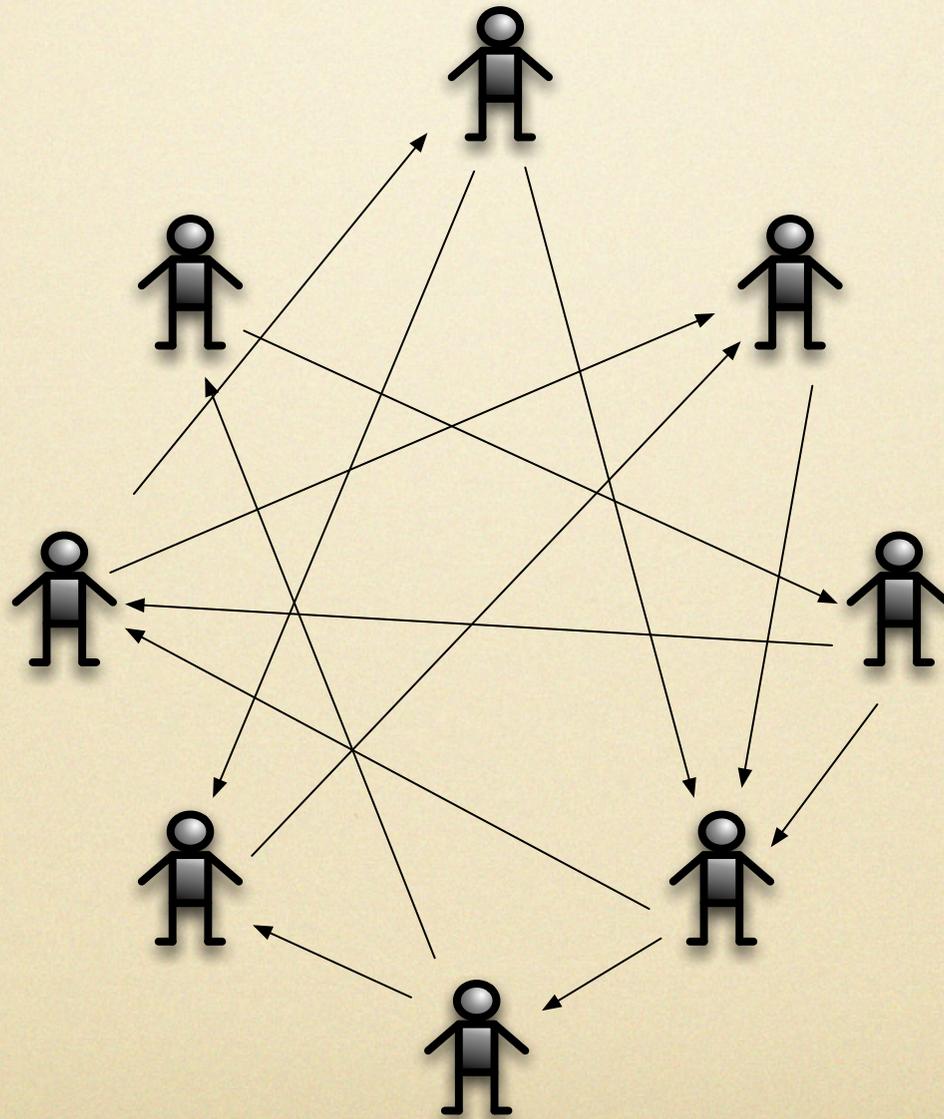
# Mediator



# No Mediator



# No Mediator



# Distributed Mediation

- A mediator can be implemented in a fully distributed manner by the players themselves (“cheap talk”) [ADGH ‘06, ADH ‘08]
- Similar to cryptographic results on e.g. global coin toss and secure multiparty computation
- This can be done quickly and with reasonable communication overhead [KS ‘09]

# Single Round

- Multi round is fine, but what about single round games???
- Problem: Mediator can no longer react to players choices
- Idea: Exploit “windfall of malice”

# Windfall of Malice

- “Windfall of malice”: Presence of adversarial players can actually decrease the price of anarchy [MSW ‘06, BKP ‘07]
- Selfish players assume adv. players are out to get them
- Idea: Design a mediator that achieves windfall of malice even without Byzantine players

# Our Technique



- Two configurations
  - “Fear Inducing”: Players who do not follow mediator’s advice have low utility
  - “Benevolent”: Optimal or near optimal social welfare

# Inoculation Game

- Each node of a grid is a player
- Players choose whether or not to inoculate
- Then, a virus infects a random node in the grid; all nodes in the uninoculated connected component of this node are infected
- Inoculation costs \$1; infection costs \$L

# Analysis

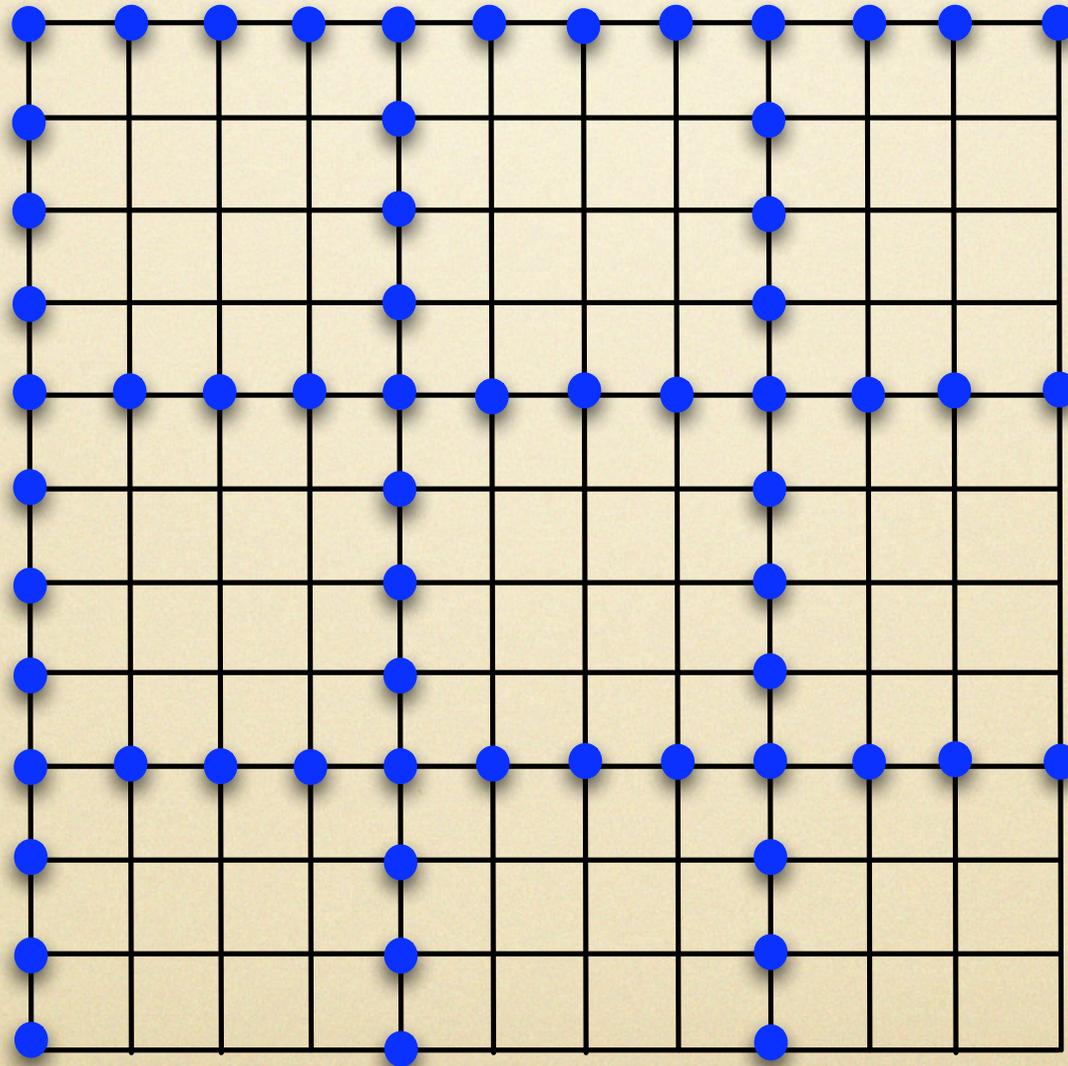
- Nash Eq.
  - Component size  $\theta(n/L)$
  - SW:  $\theta(n)$
- Optimal
  - Component size:  $\theta((n/L)^{2/3})$
  - SW:  $\theta(n^{2/3} L^{1/3})$

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Our Result: Mediator that achieves optimal SW.

# Config 1: Optimal

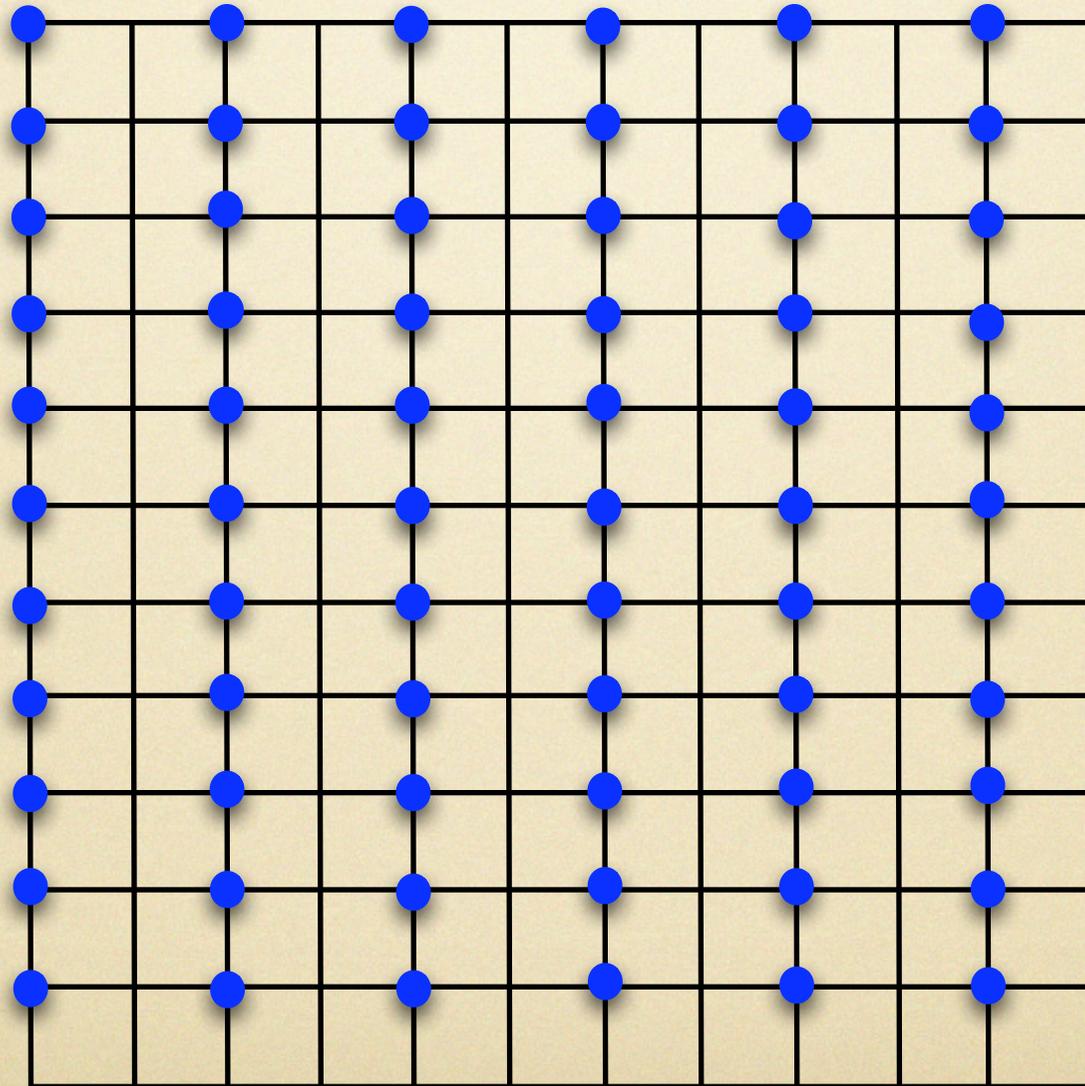


Component  
Size:

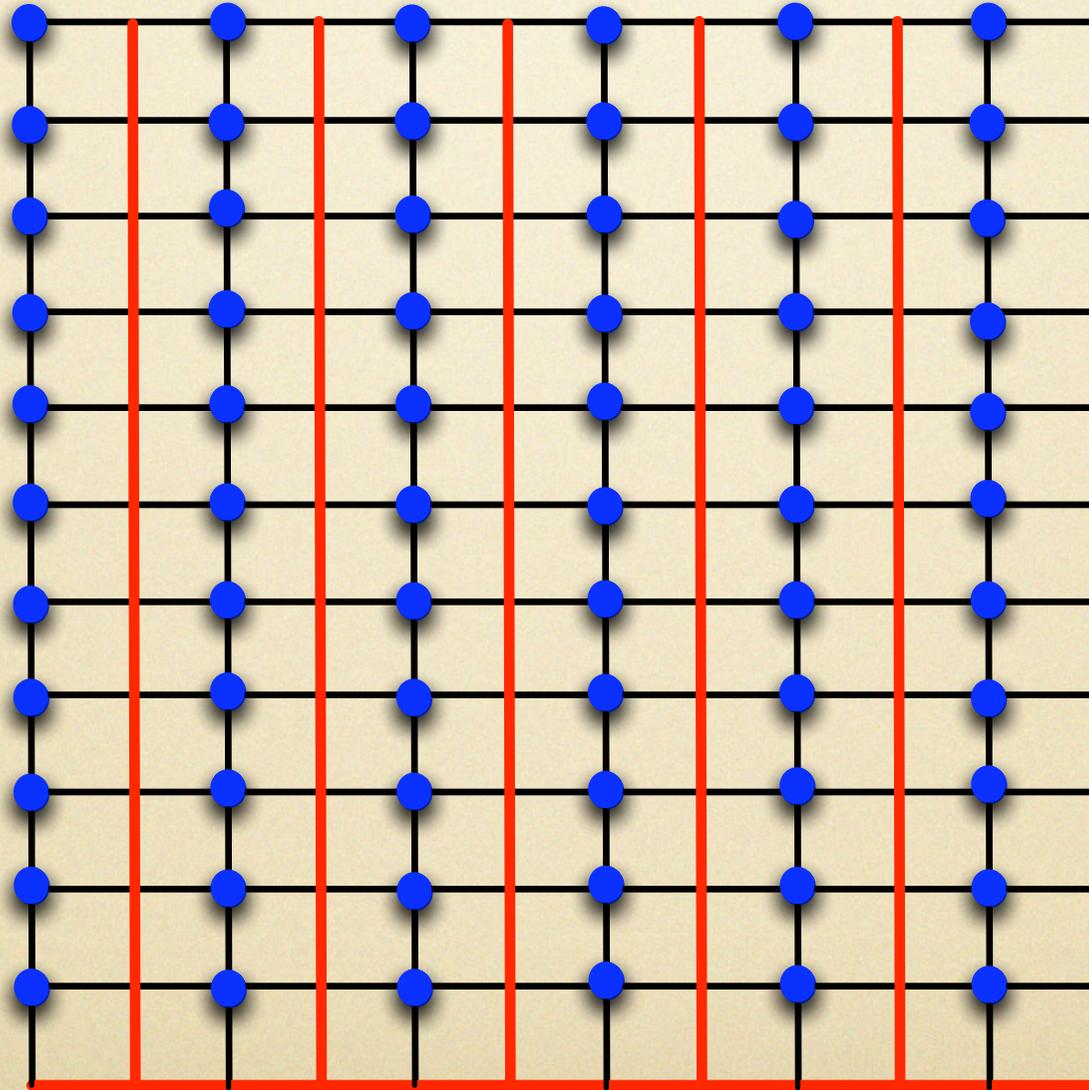
$$(n/L)^{2/3}$$

# Config 2: Fear Inducing

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# Mediator

- Mediator chooses config 1 with probability

$$p_1 = \theta(L^{-2/3}n^{-1/3})$$

- Mediator chooses config 2 with probability

$$p_2 = 1 - \theta(L^{-2/3}n^{-1/3})$$

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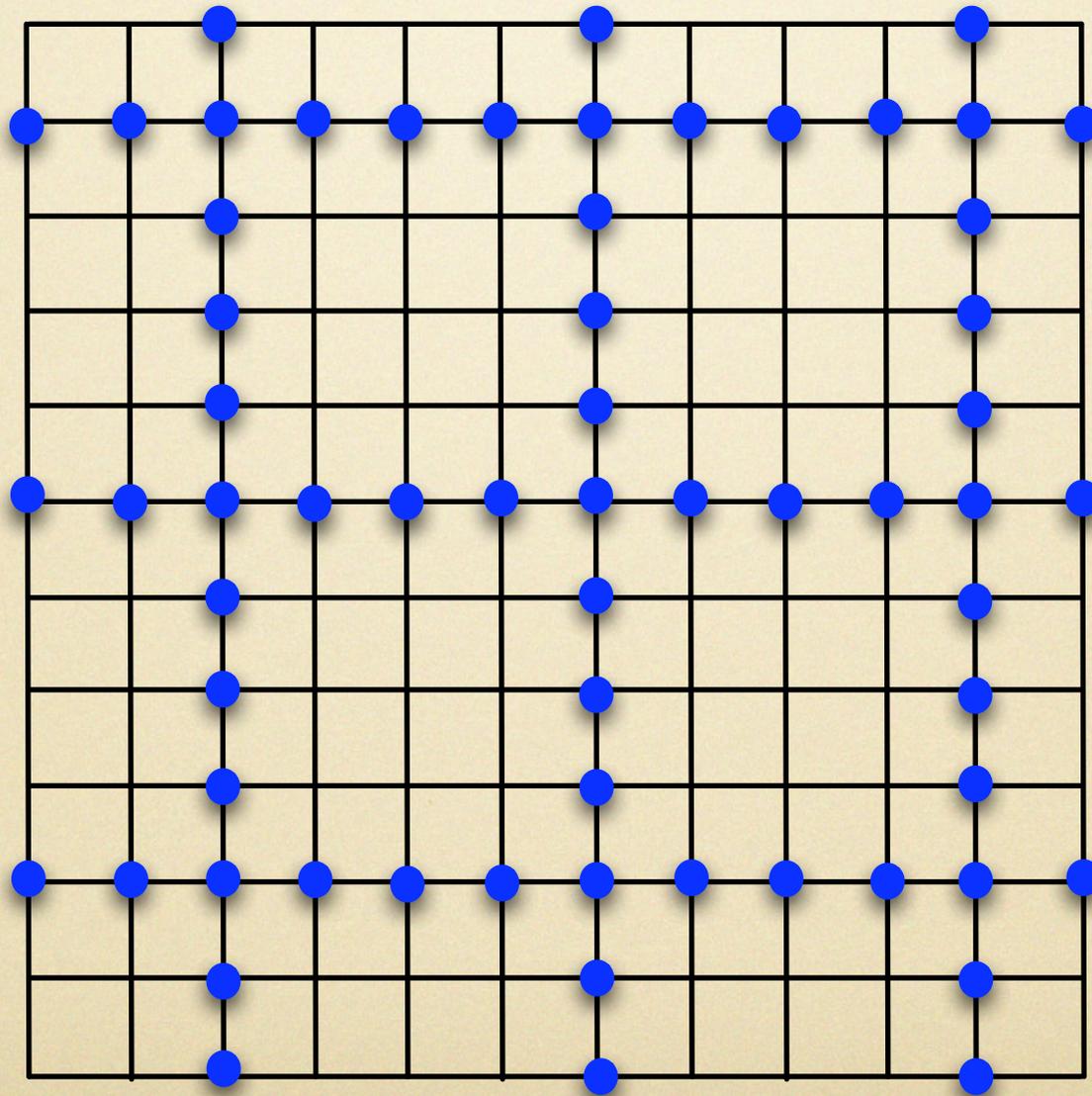
# Desired Property

- If a player is advised to inoculate, its estimate of likelihood of being in config 2 increases
- Thus, this player is more likely to follow the advice to inoculate

# Problem

- Problem: Players at certain locations can determine the configuration based on advice
- Given this info, they will not follow advice
- Solution: Randomly perturb both configurations so that each player is equally likely to be told to inoculate.

# Random Perturbation



# Fact: Players Listen

$\xi_I$  = told to inoculate

$\xi_1$  = distribution 1 chosen

$\xi_A$  = attacked

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$$\begin{aligned} Pr(\xi_A|\xi_I) &= Pr(\xi_A, \xi_1|\xi_I) + Pr(\xi_A, \bar{\xi}_1|\xi_I) \\ &= Pr(\xi_A|\xi_1, \xi_I)Pr(\xi_1|\xi_I) + Pr(\xi_A|\bar{\xi}_1, \xi_I)Pr(\bar{\xi}_1|\xi_I) \\ \dots &\geq 1/L \end{aligned}$$

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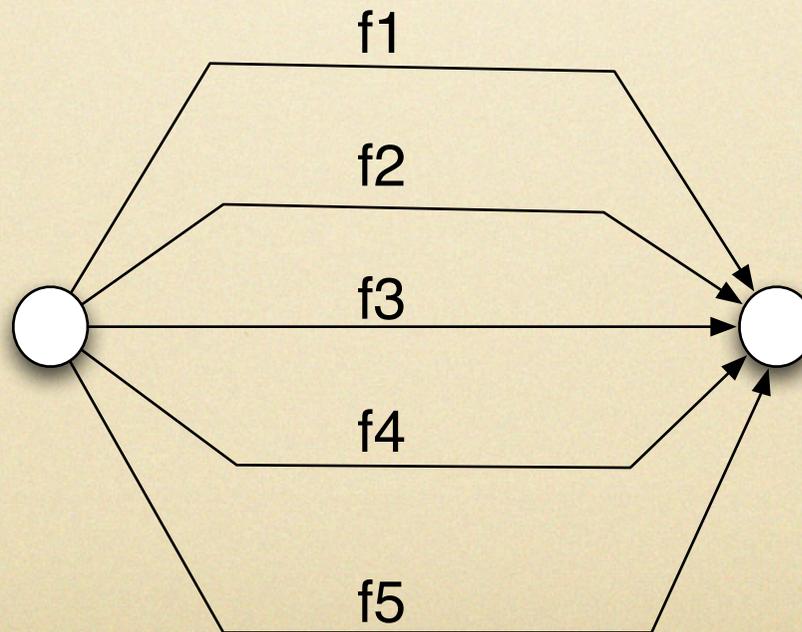
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# Intuition

- Posterior probability of being in distribution 1 increases significantly if told to inoculate
- Implies nodes that are told to inoculate are more likely to be infected
- Also, nodes told not to inoculate are very likely to be in distribution 2 and thus not to be attacked

# Generalization

- Non-atomic, anonymous, congestion games
- Sum of flows from  $s$  to  $t$  is 1
- Cost of an edge is function of flow over it



# Applicability

- Question: Can a mediator always help improve the SW of a game?
- Answer: No!

# Impossibility Result

$\mathcal{F}_h(a, x) =$  Max cost of  $a$  when  $x$  fraction of players choose  $a$

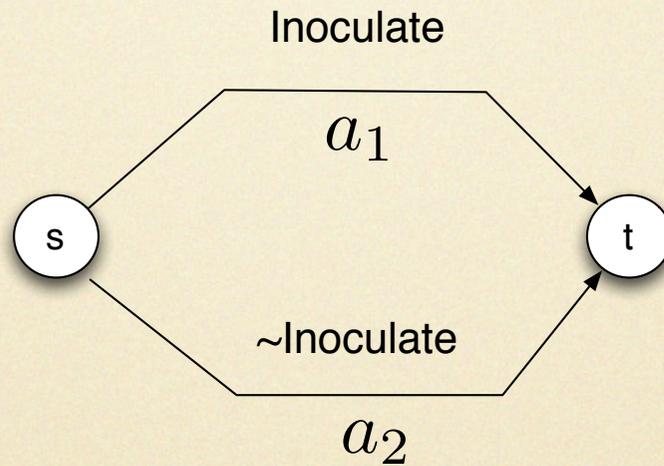
$\mathcal{F}_\ell(a, x) =$  Min cost of  $a$  when  $x$  fraction of players choose  $a$

**Theorem:** If for all  $a \in A$  and  $0 \leq x \leq x' \leq 1$ ,  $\mathcal{F}_h(a, x) \leq \mathcal{F}_\ell(a, x')$  then the smallest cost of a correlated equilibrium is no less than the smallest cost of a Nash equilibrium.

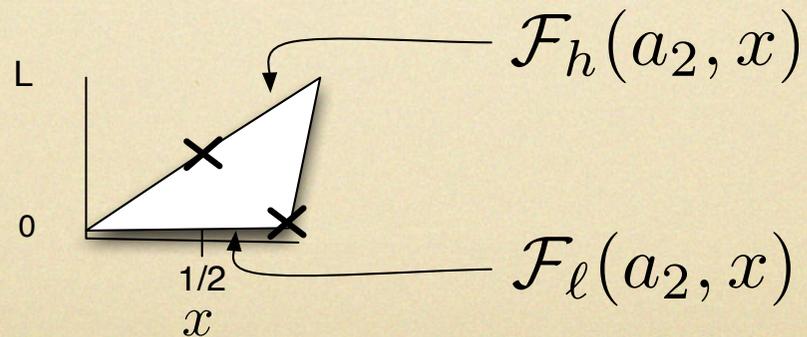
# Theorem Intuition

- Cost of some action must decrease as more players choose that action
- Otherwise, a mediator will not help

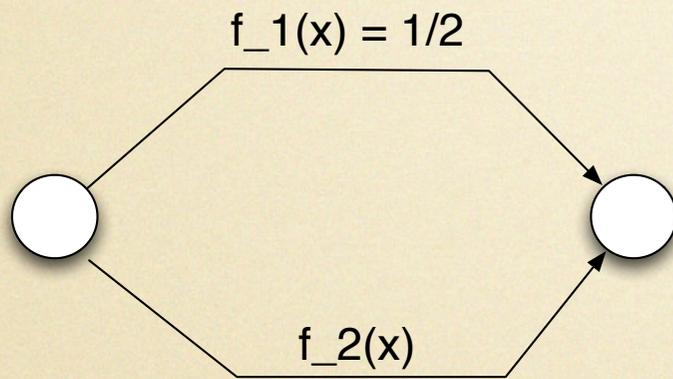
# Inoculation



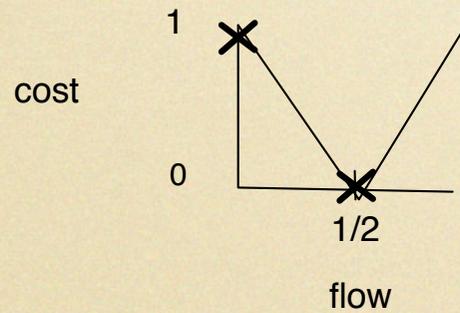
$a_2$  :



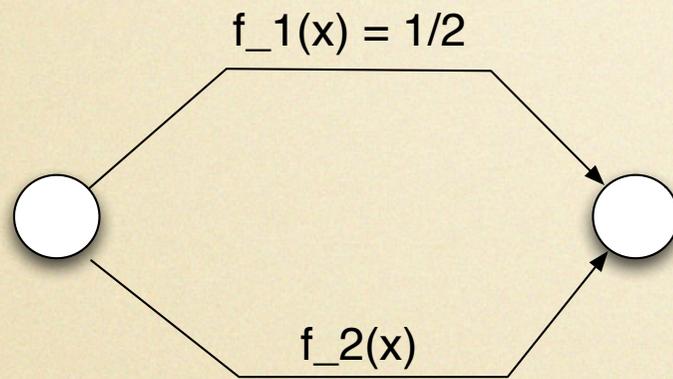
# El Farol Var.



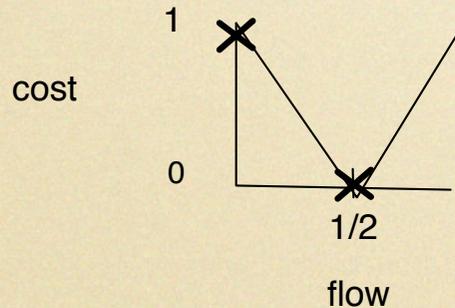
$f_2(x)$ :



# El Farol Var.



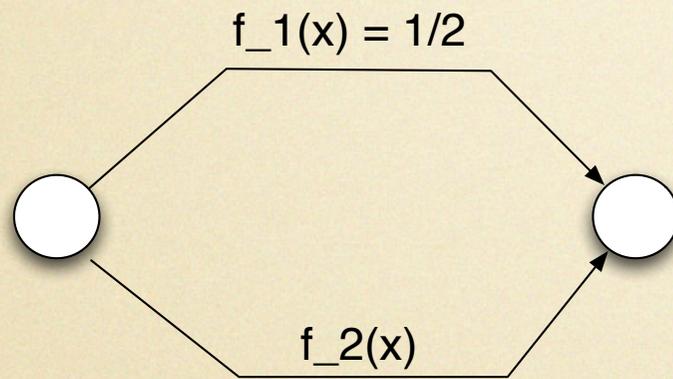
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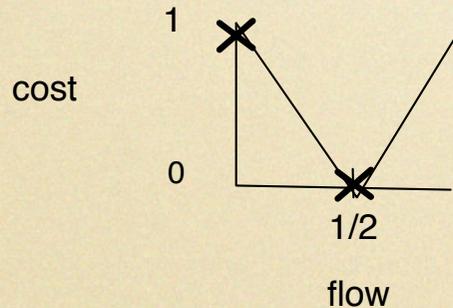
Mediator:

- With probability  $1/3$ , tell all players to go up
- With probability  $2/3$ , tell half the players to go up and half to go down

# El Farol Var.



$f_2(x)$ :

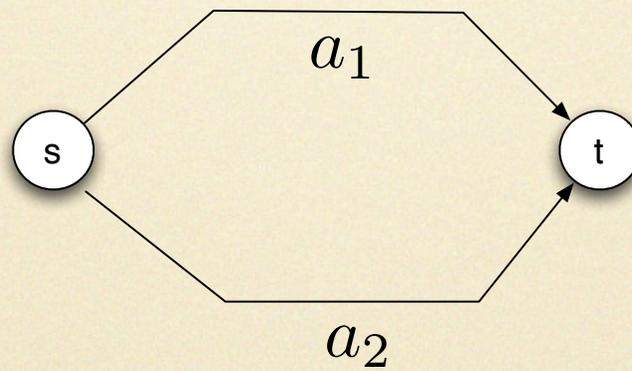


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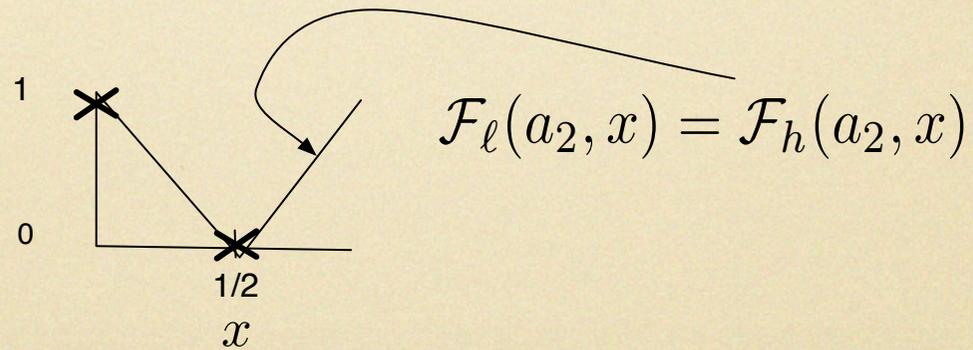
- With probability  $1/3$ , tell all players to go up
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Achieves S.W. of  $1/3$  vs  $1/2$   
for the Nash

# El Farol



$a_2$  :



# Impossibility Proof

$\text{POST}(a, a')$  = expected cost of performing action  $a$  if action  $a'$  is suggested

$\text{PRI}(a)$  = expected cost of ignoring mediator and performing action  $a$

**Lemma 1:** If conditions of theorem hold, then for all actions  $a$ ,  $\text{POST}(a, a) \geq \text{PRI}(a)$

# Lemma 2

$Y$  is cost of a player if follows advice of mediator

$X$  is cost of a player if ignores mediator and always chooses action  $a$  minimizing  $\mathbf{PRI}(a)$

**Lemma 2** For any mediator,  $E(Y) \leq E(X)$

# Main Proof

If for all  $a \in A$  and  $0 \leq x \leq x' \leq 1$ ,  
 $\mathcal{F}_h(a, x) \leq \mathcal{F}_\ell(a, x')$

Then

**Lemma 1**  $\rightarrow E(Y) > E(X)$

# Main Proof

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Then

**Lemma 1**  $\rightarrow E(Y) > E(X)$

Contradicts Lemma 2

Thus, there can be no non-trivial mediator

# Technical Challenge

- Must show that  $E(Y) > E(X)$  even when inequality in Lemma 1 is not strict
- Handle this by 1) subtle case analysis in proof of main theorem; and 2) augmenting Lemma 1 to show that in some cases inequality is strict

# Conclusion

- Described general technique for designing mediators to improve SW for some games
- Showed for large class of games, no mediator will improve SW

# Questions

- Q: Do two configurations suffice to define an optimal mediator for congestion games with just 2 edges?

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- Q: Do two configurations suffice to define an optimal mediator for congestion games with just 2 edges?
- A: In some cases, it's possible to achieve an equilibria with 3 configurations but not with 2. However, when a pair of these distributions can be used to form an equilibria, the S.W. achievable with this pair is at least as good as what is achievable with 3.

# Open Problems

- Can we determine necessary and sufficient conditions for a game to allow a non-trivial mediator
  - for general congestion games?
  - for arbitrary anonymous games?
- Can we find necessary and sufficient conditions for non-symmetric multi-round games

# Open Problems

- What does mediation say about the power of coalitions in games?
- Note: we have found that for some games, a clever coalition strategy can significantly improve the utility of all members of the coalition (provided the coalition is the right size)

# Open Problems

- Consider games where one coalition competes against another
- Many such games are like “chicken” in that a non-responsive strategy works best.
- Q: Can we design a mediator that ensures that the strategy of a coalition is non-responsive?