

# Game theory

A course for the  
MSc in ICT for Internet and multimedia

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# General applications of NE

## □ Prediction instrument

- ▣ In many cases, there is a NE (as we will see, we can extend the problem so there is always one)
- ▣ But it is not unique: we may need other points to decide which of the NEs is the most likely one
- ▣ Prediction is more accurate than IESDS

## □ Criticism of competition

- ▣ NE does not guarantee a “good” (Pareto efficient) solution, because players are driven by egoism

# Duopolies

**An interesting application of NE**

# Cournot duopoly

- Cournot (1838) anticipated Nash's results in a particular context: a special duopoly
- In the Cournot model, we have two firms (called 1 and 2) producing a good in quantities  $q_1$  and  $q_2$ . Let  $Q = q_1 + q_2$
- The cost to produce  $q$  is the same for both firms and equals  $C(q) = c q$  (with constant  $c$ )
- When the good is sold on the market, its price is  $P(Q) = a - Q$ . (with constant  $a > c$ )
- More precisely,  $P(Q) = (a - Q) h[a - Q]$

# Cournot duopoly

- If the firms choose  $q_1$  and  $q_2$  simultaneously, can we predict their optimal production?
- I.e., is there a Nash equilibrium of the game?
- Both firms  $i = 1, 2$  have a single-move strategy represented by  $q_i$  and  $S_i = [0, \infty)$ ; actually, any  $q_i > a$  is pointless, we can put  $S_i = [0, a)$
- The payoff of a firm is simply its profit (revenue minus cost):

$$u_i(q_i, q_j) = q_i [P(q_i + q_j) - c] = q_i (a - q_i - q_j - c)$$

# NE of a Cournot duopoly

- Is there any NE  $(q_1^*, q_2^*)$ ?
- For each player  $i$ ,  $q_i^*$  must satisfy:  
$$q_i^* = \operatorname{argmax}_{q_i} u_i(q_i, q_j^*)$$
- $q_i \in [0, \infty)$ :  $\operatorname{argmax}_{q_i} q_i (a - q_i - q_j^* - c)$  for  $i = 1, 2$   
$$(a - 2q_i^* - q_j^* - c) = 0$$
  - Solution (for both)  $q_1^* = q_2^* = (a - c)/3$
  - Profit (for both)  $u_1^* = u_2^* = (a - c)^2/9$

# Monopoly solution

- In case of a single firm (monopoly) the optimum production would be (set  $q_2^* = 0$ ) :

$$q_m = \operatorname{argmax}_{q_1} q_1 (a - q_1 - c)$$

$$q_m = (a - c) / 2$$

- In which case the profit is  $u_m = (a - c)^2 / 4$
- We call it  $q_m$  not  $q_1^*$  because it is different
  - ▣ The monopolist produces less than the two firms together (at monopoly,  $Q = q_m < q_1^* + q_2^*$ )
  - ▣ Lower production  $\rightarrow$  higher price  $\rightarrow$  profit!

# Trust case

- The two firms could compare their NE, which achieves profit  $u^* = (a - c)^2/9$ , with the following alternate solution
- They could cooperate as it were a monopoly
- They produce half of  $q_m$ , so they could share  $u_m = (a - c)^2/4$ . Hence, profit is higher
- In other words, they produce less than the equilibrium so the price is higher and therefore the revenue is increased



# Why is it not a NE?

- Each firm has an incentive to deviate from such a strategy ( $q_1 = q_m/2$  is not best response to  $q_2 = q_m/2$  and vice versa)
- As the price is high, unilaterally increasing the production level will raise the revenue (while decreasing that of the other firm)
- At the same time, this decreases the price, so this deviation goes on as long as there is no longer incentive in betraying the trust

# Bertrand duopoly

- Bertrand (1883) argued against Cournot model that firms choose prices, not  $q_j$  s
- Now, we have an **entirely different** game. Strategies are prices  $p_i$  and  $p_i \in S_i = [0, \infty)$
- E.g., assume people buy  $q_i = a - p_i$  from the firm with cheaper price and 0 from the other (if the  $p_i$  s are equal, share  $q_i$  between them)
- Cost is  $C(q) = c q$  (as in Cournot case,  $a > c$ )
- Competition leads to lowering the price
- NE of this game is  $p_1^* = p_2^* = c$

# Bertrand duopoly

- Similarly to Cournot's, Bertrand equilibrium is clearly not the best outcome for the firms
- In fact, they could agree on a higher price and share the market. The price can be pushed up to  $(a + c)/2 > c$
- However, this is not a NE as each of the firm has a (selfish) incentive to deviate, i.e., decrease price, so as to conquer the market
- This process is indefinitely repeated as long as the price is  $c$

# Bertrand duopoly

- Interestingly, both firms set price=cost
  - ▣ which means they have zero profit
- The reason of this strange outcome is in the best response to the beliefs of the players
  - ▣ if firm 1 has the belief that firm 2 sets  $p_2=c$ , profit for firm 1 will be 0 anyways
- Be careful! Profit is 0 even if firm 1 sets  $p_1 > c$ 
  - ▣ but  $(c + \varepsilon, c)$  is NOT a Nash equilibrium, because not all players choose a best response (firm 1 is, but firm 2 is not)

# Bertrand duopoly

- Economic-wise, Bertrand equilibrium is nice for the customers. But, is it realistic?
- Explanation? Imperfect substitutes
- Let  $q_i = a - p_i + b p_j$  (with constant  $b < 2$ )
- Note: this is **yet another game!**
- $b$  is a sort of exchange rate between goods.
- It can be shown that there is a Nash eq.  
$$p_1^* = p_2^* = (a + c)/(2 - b)$$

# Bertrand duopoly

- Or, consider a case with different costs
  - ▣ For example,  $c_1=1, c_2=2$  (cost advantage for 1)
  - ▣ For simplicity, prices are set in steps of  $\varepsilon = 0.01$
- Now, there is no way firm 2 can “win”
  - ▣ Firm 1 can set  $p_1=1.99$  and becomes monopolist
  - ▣ One possible Nash equilibrium is  $(1.99, 2.00)$
  - ▣ However, if  $\varepsilon \rightarrow 0$  we have a problem  
 $(2,2)$  is not a NE as payoffs are discontinuous
  - ▣ Discretizing the state space is a trick often used to avoid this kind of problems

# Hotelling model

- Hotelling (1929) proposed a model of competition, readjusted here as follows
- Two street vendors of ice-cream serve a seaside boulevard, assumed 1 km long
  - ▣ Ice-cream cones sold by the vendors are perfect substitutes for each other (→ same price)
  - ▣ People buy ice-cream by the nearer vendor
  - ▣ People distribution on the street is uniform
  - ▣ For modeling ease, assume 101 possible locations (one each 10 meters): 0, 1, ..., 99, 100

# Hotelling model

- If vendor A chooses 22 and vendor B chooses 35, vendor A gets all the people from 0 to 28
  - ▣ but A has an incentive to move right (actually, he can do better by moving to 36)
- Easy to see the only NE: they both choose 50
  - ▣ Such a result has often been used as a political paradigm (median voter theorem)
  - ▣ Political convergence “to the middle point”



# The problem of commons

**Why is common resource often wasted?**

# The tragedy of commons

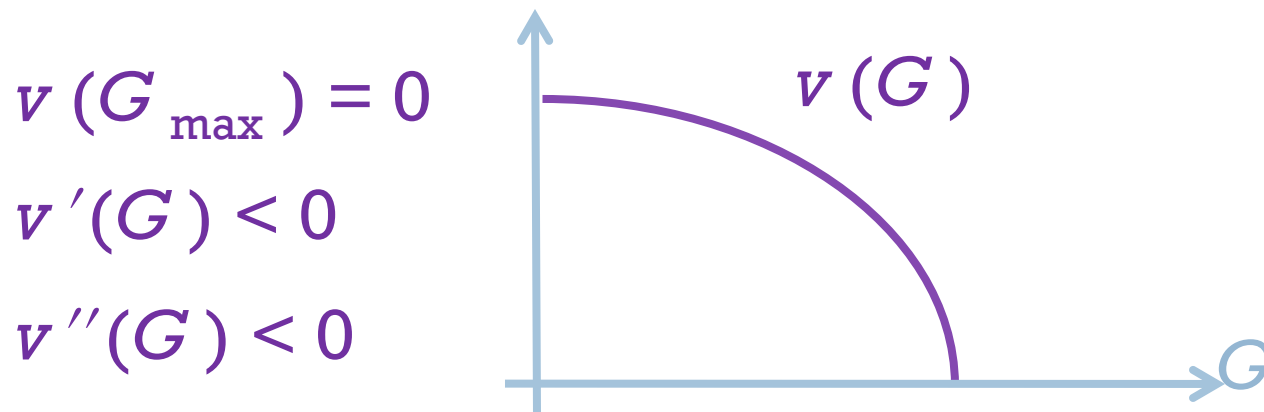
- Many political philosophers and economists, since at least Hume (1739) have understood that, if moved only by private incentives, citizens tend to misuse public resources
- Environmental pollution is an example
- This problem is commonly referred to as the “tragedy of commons”
- There are several ways to see it

# The tragedy of commons

- Classic version (Hardin, 1968):
  - ▣ We have  $n$  farmers in a village, which forage their goats in a common green
- Each farmer owns  $g_i$  goats
- $G = g_1 + g_2 + \dots + g_n$
- Each goat costs  $c$  in caring expenses
- The use of the common green shared by  $G$  goats has a value of  $v(G)$  per goat
- The value decreases with  $G$

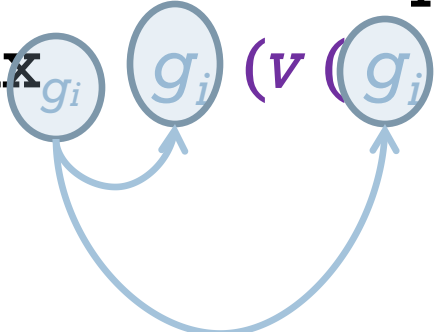
# The tragedy of commons

- An information-theory version.
  - ▣ We have  $n$  users of a WiFi hotspot, accessing a shared spectrum. Each activates  $g_i$  processes
- The overall network throughput has a value of  $v(G)$  per process (decreasing with  $G$ )



# The tragedy of commons

- The payoff to each user is  $g_i (v(G) - c)$
- We write  $g_{-i} = (g_1, \dots, g_{i-1}, g_{i+1}, \dots, g_n)$
- Let find the Nash equilibrium  $g_i^*$

$$\max_{g_i} g_i (v(g_i + g_{-i}^*) - c)$$


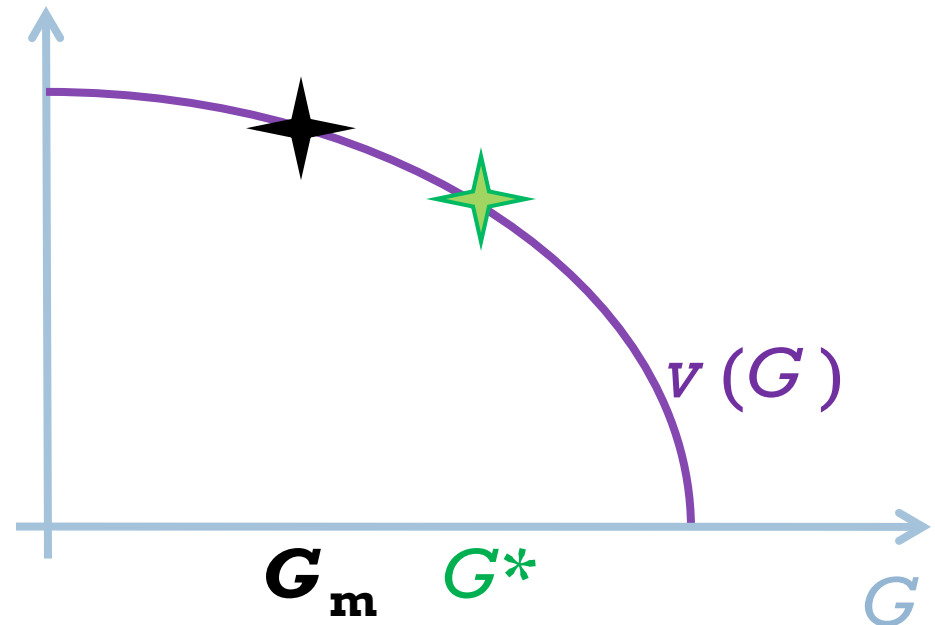
- Now replace  $g_i^*$  with  $G^* / n$   

$$v(G^*) + G^* v'(G^*) / n - c = 0$$

# The tragedy of commons

- For the NE  $v(G^*) + G^* v'(G^*)/n - c = 0$
- The global welfare is  $G(v(G) - c)$ , so we have an optimum at  $G_m$  for which  $v(G_m) + G_m v'(G_m) - c = 0$

$$v(G_m) + G_m v'(G_m) = v(G^*) + G^* v'(G^*)/n$$



# The tragedy of commons

- At NE, it holds  $v(G^*) + v'(G^*) G^* / n - c = 0$  which reflects the following fact.
- A user with  $g_i$  possessions (goat or processes) may consider adding an “increment”  $h$  :
  - ▣ the cost of the possessions increases by  $ch / h = c$
  - ▣ its possessions lose value by  $(v(G + h) - v(G)) / h$  that is,  $v'(G)$ , summing to a total of  $v'(G) g_i$
  - ▣ At the NE (symmetry) all users have  $g_i = G^* / n$
- The global viewpoint considers the loss of all users, which is  $v'(G_m) G_m$  (no  $1/n$  term)

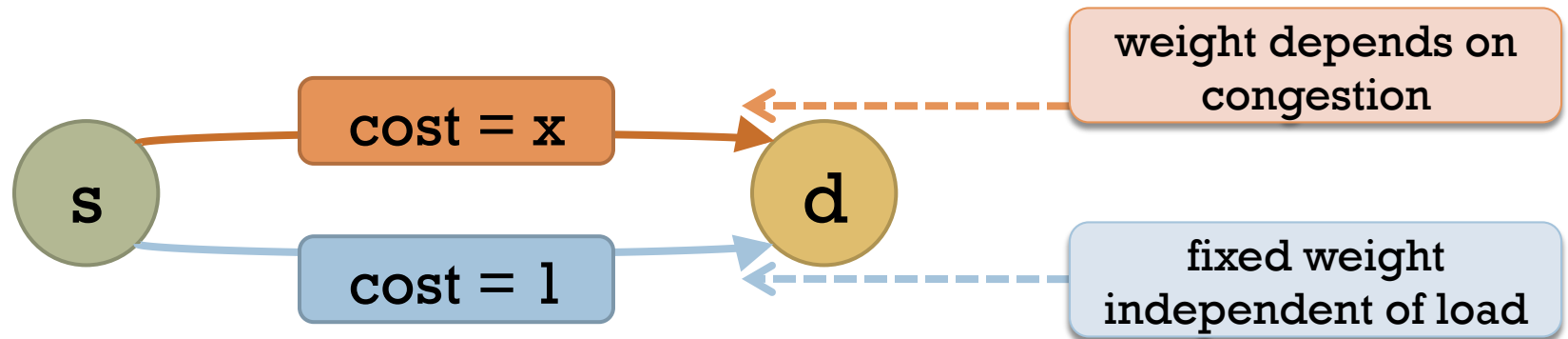
# Selfish routing

A scenario with high Price of Anarchy



# Selfish routing

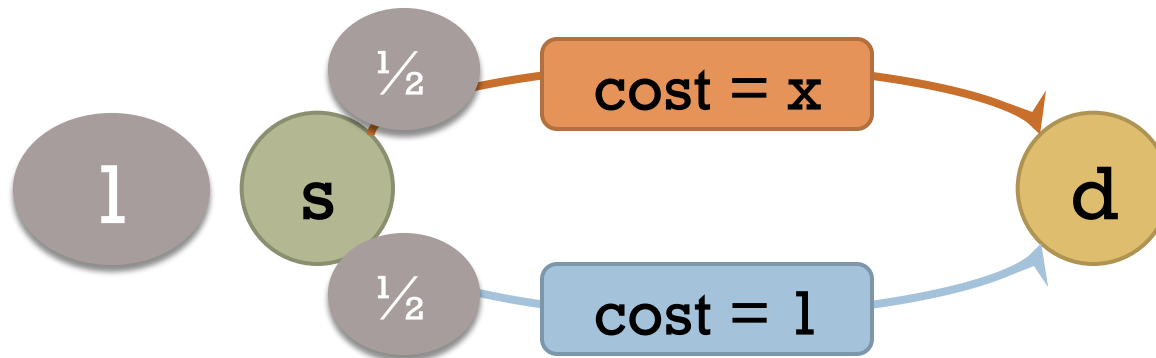
- Pigou (1920): 2 paths from s to d
  - ▣  $\text{Cost} \propto \text{congestion}$  for one path



- Say 1 unit of traffic goes from s to d
- Top edge is a dominant strategy
- All traffic incurs a cost of 1

# Selfish routing

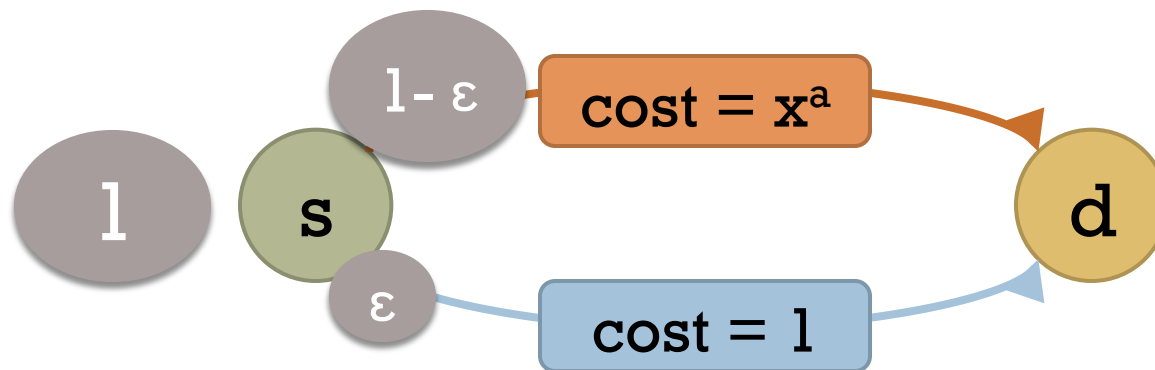
- Can we do better? Split traffic  $\frac{1}{2}$  and  $\frac{1}{2}$



- Unit cost is  $\frac{1}{2}$  on upper edge, 1 on lower
- Average cost is  $\frac{3}{4}$ . Overall optimum, but players have incentive to deviate
- Price of Anarchy =  $\frac{4}{3}$ .

# Selfish routing

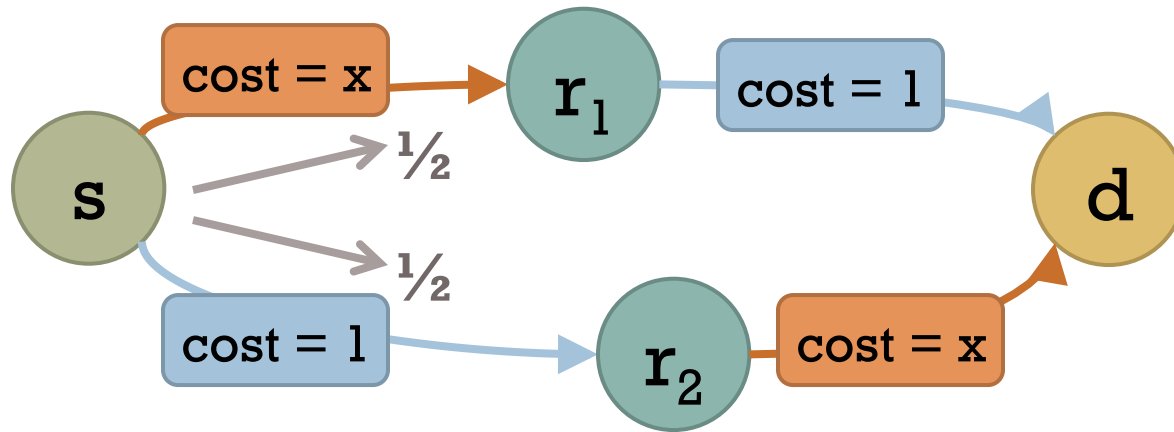
- Even worse with non-linear cost ( $a > 1$ )
- Assume  $a$  is large



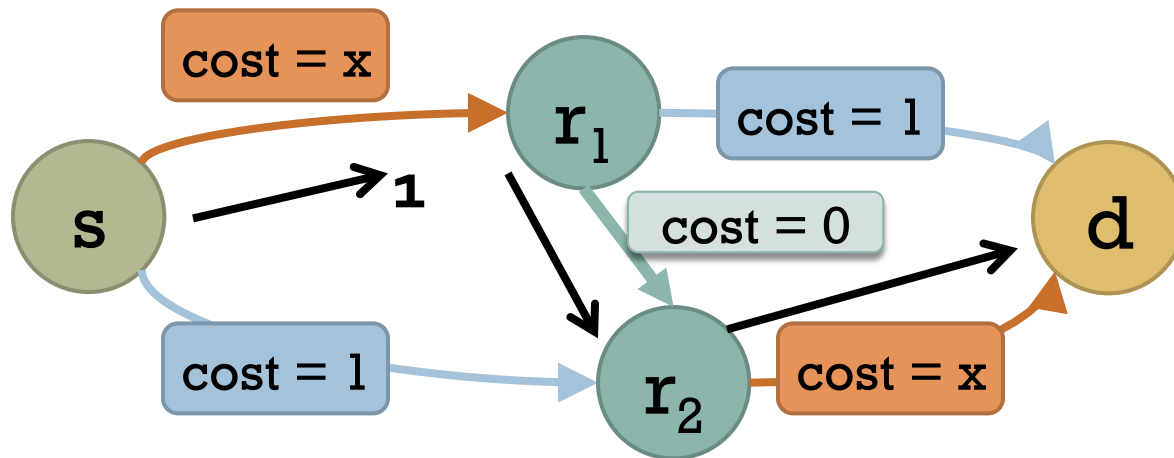
- Top path is again dominant, total cost = 1
- If a fraction  $\epsilon$  goes below,  $\text{cost} = (1-\epsilon)^a + \epsilon$ 
  - ▣ For  $a \rightarrow \infty$ ,  $\text{cost} \rightarrow 0$  : Unbounded PoA

# The Braess paradox

- A “better” network can have a “worse” NE



□ Cost =  $3/2$



□ Cost =  $2$   
(despite adding a costless cut)

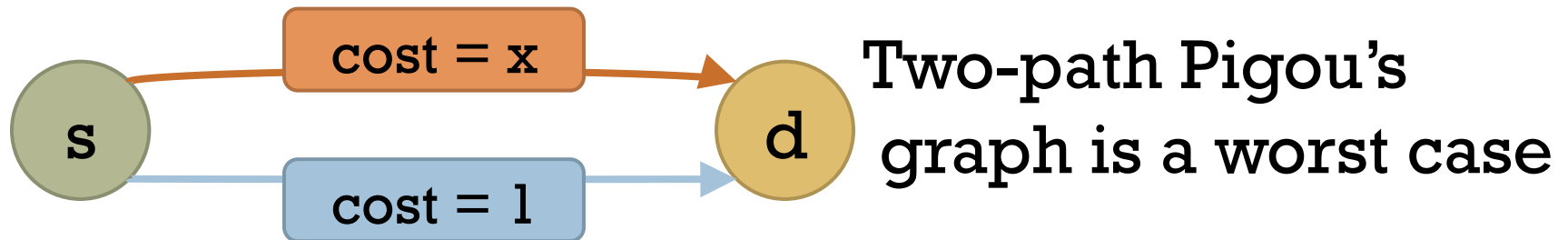
# Linear costs

## □ Theorem

(for linear latencies)

Cost of Nash flow =  $\frac{4}{3}$  Optimal flow cost

PoA



- **Intuition:** When confronted with two choices, all selfish users take the better one  $\rightarrow$  overload
- **Intrinsic PoA, does not depend on topology**