

# Market Games

*An analysis of efficiency and strategy*

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# Talk Outline

- Markets -Brief history and modern notions
- The supply and demand curve
- Fisher Market games
  - ▶ Equilibrium–Efficiency and strategic behaviour
  - ▶ Key lemmas and features of equilibria
- The cowherds of Gokul
- The engineering placement game

# History

- **Exchange, Trade and Money** and **Emergence of money**
  - ▶ gifts and presents, totemic money, account-keeping
  - ▶ coinage—taxes, armies, levies, mercantile money
  - ▶ fiat money—monetary theories
- **Markets in India** -taxes, unmonetised commodity exchanges through *jatras*, services through *balutedari*, the *kirana*, the *savkar*, the SHG, the Mall!
- **Markets**-models and mechanisms
  - ▶ Walras and tatonnement
  - ▶ Condorcet and other markets—rudiments of strategy
  - ▶ Efficiency—Fisher
- **Modern markets**
  - ▶ price as the signal—producer and consumer surplus
  - ▶ believed to be efficient in allocation of resources
  - ▶ Arrow and Debreu and the social welfare theorems

# Motivation

- **Markets**-buyers with money and preferences, sellers with goods and quantities-**agents**
  - ▶ Equilibrium-Price discovery and allocations.
  - ▶ Various models: Fisher, Arrow-Debreu etc.
- **Expectation**: The markets are efficient.
  - ▶ allocate resources, require very little interference, predictable
  - ▶ rationality is sufficient, **punish irrationality**
- **Our findings**: Under strategic (**non-cooperative**) behaviour by agents (buyers).
  - ▶ highly unpredictable
  - ▶ induce outside-market relationships

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- **Our findings**: Under strategic (**non-cooperative**) behaviour by agents (buyers).
  - ▶ highly unpredictable
  - ▶ induce outside-market relationships
- **A model for markets** : Single-commodity, Fisher market,
- **A model for strategic behaviour** : Games, Nash Equilibrium Gokul, engineering placements.

# Games, Nash Equilibrium

- Players:  $\{1, \dots, N\}$
- Strategy spaces:  $\mathbb{S}_1, \dots, \mathbb{S}_N$
- Set of strategy profiles:  $\mathbb{S} = \mathbb{S}_1 \times \mathbb{S}_2 \times \dots \times \mathbb{S}_N$
- Payoff functions:  $u_i : \mathbb{S} \rightarrow \mathbb{R}$

## Nash Equilibrium (NE):

- is the solution concept of a game, where no player benefits by changing her strategy unilaterally.
- $S = (s_1, \dots, s_N)$  is a strategy profile, where each  $s_i \in \mathbb{S}_i$ .
- $S$  is a NE iff  $\forall i$  and  $\forall s'_i \in \mathbb{S}_i$ ,  $u_i(s'_i, S_{-i}) \leq u_i(s_i, S_{-i})$ .
- $S_{-i} = (s_1, \dots, s_{i-1}, s_{i+1}, \dots, s_N)$ .

# Example

## Prisoner's Dilemma

- $N = 2, S_1 = S_2 = \{\text{confess (C), don't confess (D)}\}$ .

• Payoff matrix:

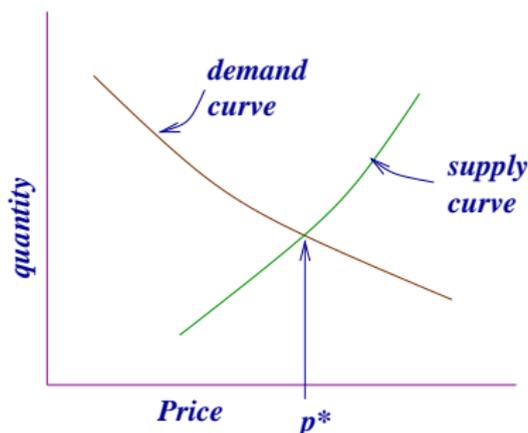
	C	D
C	1,1	6,0
D	0,6	5,5

- $(C, C)$  is the only NE with payoff  $(1, 1)$ .
- $(D, D)$  has payoff  $(5, 5)$ , but not stable.

Though it has drawbacks, the Nash equilibrium and its extensions (repeated, correlated) are generally considered acceptable.

# The Supply-Demand curve and price discovery

- There is a supply curve  $Supp(p)$ , amount of goods which will be supplied at a price  $p$ .
- There is a demand curve  $Dem(p)$ , i.e., the amount demanded at the market price  $p$ .
- The **market price**  $p^*$  is given by the intersection of the supply curve and the demand curve, i.e., the price at which supply equals demand.



# Implementation

Ability to pay	1	2	2	2	3	4
Ability to produce	1	1	2	2	2	3

The market price is  $p^* = 2$  and at that price  $S(p^*) = D(p^*) = 5$ . But how does it really work?

- Sellers as agents with  $p_i$  as offer price and  $c_i$  as cost price.
- If  $(p_1, \dots, p_k)$  are offer prices then if  $|D(p_i)| \geq |\{j | p_j \leq p_i\}|$ , sale is guaranteed. **Payoff 1** and **0 otherwise**.
- $p^* = p_i$  when  $c_i \leq p^*$  and  $p_i = c_i$  otherwise is Nash equilibrium.
- Thus, the NE strategy *discovers* the optimum price  $p^*$ .
- **Many implicit assumptions**: Why not just a matching of a supplier with a demander?

# The Fisher Market (Linear Case)

**Input:** A set of buyers ( $\mathcal{B}$ ), a set of goods ( $\mathcal{G}$ ), and  $\forall i \in \mathcal{B}, \forall j \in \mathcal{G}$ :

- $u_{ij}$  : payoff (i.e., happiness) of buyer  $i$  for a unit amount of good  $j$
- $m_i$  : money possessed by buyer  $i$
- $q_j$  : quantity of good  $j$

**Goal:** Computation of equilibrium prices  $(p_j)_{j \in \mathcal{G}}$  and an equilibrium allocation  $X = [x_{ij}]_{i \in \mathcal{B}, j \in \mathcal{G}}$  such that

- **Market Clearing:**

$$\forall j \in \mathcal{G}, \sum_{i \in \mathcal{B}} x_{ij} = q_j \text{ and } \forall i \in \mathcal{B}, \sum_{j \in \mathcal{G}} x_{ij} p_j = m_i$$

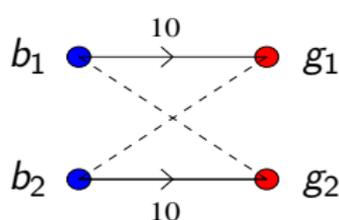
- **Optimal Goods:**  $x_{ij} > 0 \implies \frac{u_{ij}}{p_j} = \max_{k \in \mathcal{G}} \frac{u_{ik}}{p_k}$ .

Payoff (**happiness**) of buyer  $i$  w.r.t.  $X$  is  $u_i(X) = \sum_{j \in \mathcal{G}} u_{ij} x_{ij}$

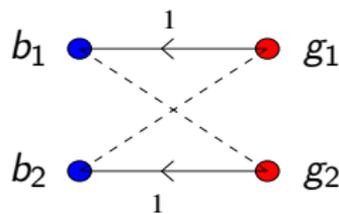
## Example

Input:  $U = \begin{bmatrix} 10 & 3 \\ 3 & 10 \end{bmatrix}$ ,  $\mathbf{m} = \langle 10, 10 \rangle$ ,  $\mathbf{q} = \langle 1, 1 \rangle$ .

Output:  $\langle p_1, p_2 \rangle = \langle 10, 10 \rangle$ ,  $X = \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}$ .



money flow



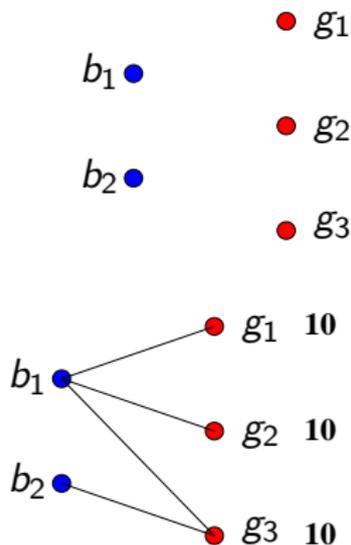
allocation

$$u_1(X) = 10, u_2(X) = 10.$$

Somewhat like a flow problem. Much attention and recent solution in strongly polynomial time by Orlin.

# Basic Steps

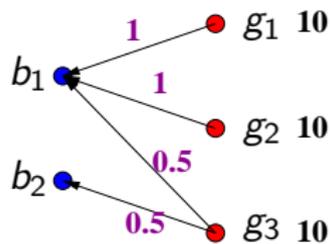
- Guess the prices.
- Set up the **Tight Graph**
  - ▶  $(b_i, g_j)$  is an edge iff it is most efficient.
- See if the flow problem is solvable.



$$U_1 = [1 \ 1 \ 1]$$

$$U_2 = [1 \ 2 \ 3]$$

$$m_1 = 25 \quad m_2 = 5$$

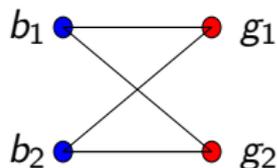


# Observations

- Equilibrium prices are unique and equilibrium allocations form a convex set.
- Solution is independent of scaling  $u_{ij}$ 's.
- Quantity of goods may be assumed to be unit.
- All equilibrium allocations give the same payoff to a buyer.

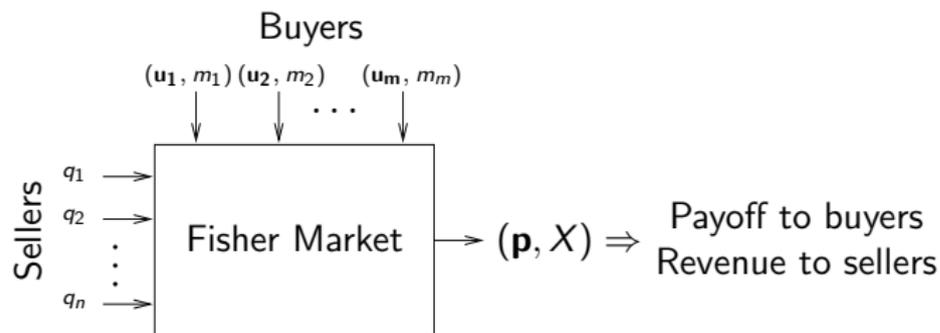
Example:  $U = \begin{bmatrix} 1 & 19 \\ 1 & 19 \end{bmatrix}, \quad \mathbf{m} = \langle 10, 10 \rangle.$

$$\langle p_1, p_2 \rangle = \langle 1, 19 \rangle,$$



- Payoff tuple is  $(10, 10)$  from any equilibrium allocation.

# The Fisher Market Game



**Question:** How does the market work with strategic buyers?

- We take utility tuples as the strategies.
- naive hope: honestly posting utilities is the best strategy

# Better Payoff?

**Question:** Does a buyer have a strategy to achieve a better payoff?

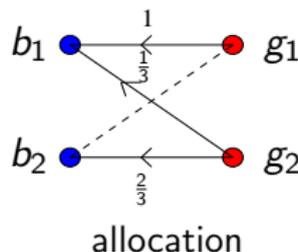
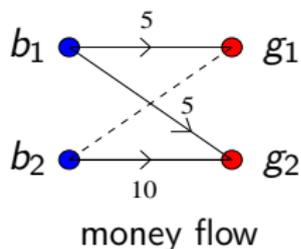
**Answer:** Yes!

In the previous example ( $U = \begin{bmatrix} 10 & 3 \\ 3 & 10 \end{bmatrix}$ ,  $\mathbf{m} = \langle 10, 10 \rangle$ ),  
if buyer 1 poses utility tuple as  $\langle 5, 15 \rangle$  instead of  $\langle 10, 3 \rangle$ , then

**Output:**

$$\langle p_1, p_2 \rangle = \langle 5, 15 \rangle$$

$$X = \begin{bmatrix} 1 & \frac{1}{3} \\ 0 & \frac{2}{3} \end{bmatrix}$$



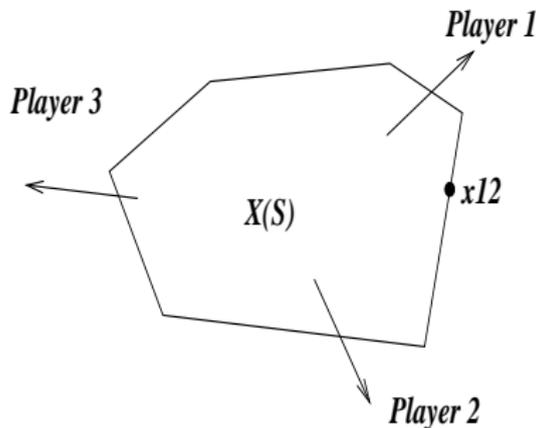
- $u_1(X) = 11, u_2(X) = \frac{20}{3}$ .
- Note that payoff is calculated w.r.t. the true utility tuples.

# The Fisher Market Game

- Buyers are the players with  $m = |\mathcal{B}|$  and  $n = |\mathcal{G}|$ .
- Strategy Set of buyer  $i$ : All possible utility tuples, i.e.,  
 $\mathbb{S}_i = \{ \langle s_{i1}, \dots, s_{in} \rangle \mid s_{ij} \geq 0, \sum_{j \in \mathcal{G}} s_{ij} \neq 0 \}$ .
- Set of strategy profiles  $\mathbb{S} = \mathbb{S}_1 \times \dots \times \mathbb{S}_m$ .

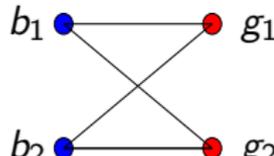
When a strategy profile  $S \in \mathbb{S}$  is played,

- equilibrium prices  $\mathbf{p}(S)$  and a set of equilibrium allocations  $\mathbb{X}(S)$  are computed w.r.t.  $S$  and  $\mathbf{m}$ .
- Different allocations  $X \in \mathbb{X}(S)$  may give different happinesses to a buyer forcing a conflict resolution!



## Example - Different Payoffs

- Consider previous example ( $U = \begin{bmatrix} 10 & 3 \\ 3 & 10 \end{bmatrix}$ ,  $\mathbf{m} = \langle 10, 10 \rangle$ ), and the strategy profile  $S = (\langle 1, 19 \rangle, \langle 1, 19 \rangle)$ .

- $G(S) =$ 

 $\mathbf{p}(S) = \langle 1, 19 \rangle$ .

- $X_1 = \begin{bmatrix} 1 & \frac{9}{19} \\ 0 & \frac{10}{19} \end{bmatrix}$ ,  $X_2 = \begin{bmatrix} 0 & \frac{10}{19} \\ 1 & \frac{9}{19} \end{bmatrix}$ ,  $X_1, X_2 \in \mathbb{X}(S)$ .

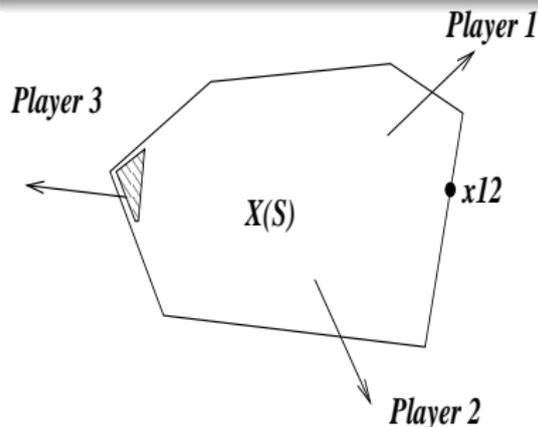
- Among all allocations in  $\mathbb{X}(S)$ , the highest payoff
  - ▶ for buyer 1 is from  $X_1$ ;  $u_1(X_1) = 11.42$ ,  $u_2(X_1) = 5.26$ .
  - ▶ for buyer 2 is from  $X_2$ ;  $u_1(X_2) = 1.58$ ,  $u_2(X_2) = 7.74$ .
- No allocation gives the highest payoff to both the buyers.

## Definition

- A strategy profile  $S$  is said to be **conflict-free** if  $\exists X \in \mathbb{X}(S)$ , such that  $u_i(X) = w_i(S)$ ,  $\forall i \in \mathcal{B}$ .
- Such an  $X$  is called a **conflict-free allocation**.

## Lemma

For a strategy profile  $S = (s_1, \dots, s_m)$ , if  $u_k(X) < w_k(S)$  for some  $X \in \mathbb{X}(S)$  and  $k \in \mathcal{B}$ , then  $\forall \delta > 0$ ,  $\exists S' = (s'_1, \dots, s'_m)$ , where  $s'_i = s_i$ ,  $\forall i \neq k$ , such that  $u_k(X') > w_k(S) - \delta$ ,  $\forall X' \in \mathbb{X}(S')$ .



This paves the way for a suitable pay-off function and allows for the notion of Nash equilibrium.

## Example - Conflict Removal

- Consider previous example ( $U = \begin{bmatrix} 10 & 3 \\ 3 & 10 \end{bmatrix}$ ,  $\mathbf{m} = \langle 10, 10 \rangle$ ,  $S = (\langle 1, 19 \rangle, \langle 1, 19 \rangle)$ ).
- For  $\delta = 0.1$  and buyer 1, consider  $S' = (\langle 1.1, 18.9 \rangle, \langle 1, 19 \rangle)$ .



- $G(S') =$



- Unique equilibrium allocation, i.e.,  $\mathbb{X}(S') = \{X'\}$ .
- $u_1(X') = 11.41$ ,  $u_2(X') = 5.29$ .
- **Recall:**  $w_1(S) = 11.42$ , hence  $u_1(X') > w_1(S) - \delta$ .

# Characterization of NESPs - Necessary Conditions

## Theorem

*If there is a Nash equilibrium  $S$  then it is conflict-free, i.e.,  $\exists X \in \mathbb{X}(S)$  such that  $u_i(X) = w_i(S), \forall i \in \mathcal{B}$ , i.e.,  $S$  is conflict-free.*

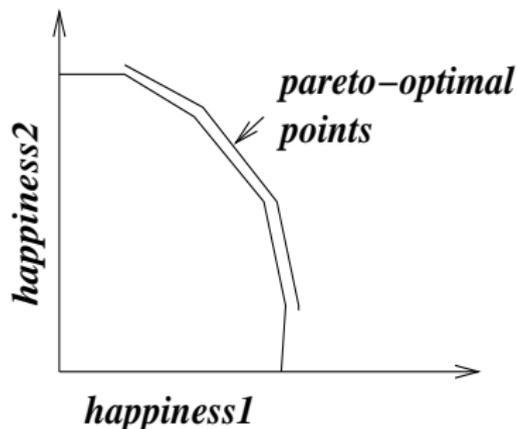
# Symmetric NESP

## Definition

A strategy profile  $S = (s_1, \dots, s_m)$  is said to be a *symmetric* strategy profile if  $s_1 = \dots = s_m$ . “Unanimity” on the relative importance of goods.

## Lemma

*The payoff w.r.t. a symmetric NESP is Pareto optimal.*



# Complete Characterization of Symmetric NESPs

## Proposition

*A symmetric strategy profile  $S$  is a NESP iff it is conflict-free.*

## Corollary

*A symmetric NESP can be constructed, whose payoff is the same as the Fisher payoff. **The truthful strategy is not NE.***

## Example - Asymmetric NESP (not Pareto Optimal)

Input:  $U = \begin{bmatrix} 2 & 3 \\ 4 & 9 \\ 2 & 3 \end{bmatrix}$ ,  $\mathbf{m} = \langle 50, 100, 50 \rangle$ .

- $\mathbf{s}_1 = \langle 2, 0 \rangle$ ,  $\mathbf{s}_2 = \langle 2, 3 \rangle$ ,  $\mathbf{s}_3 = \langle 0, 3 \rangle$ , and  $\mathbf{s} = \langle 2, 3 \rangle$ .
- $S_1 = (\mathbf{s}_1, \mathbf{s}_2, \mathbf{s}_3)$  and  $S_2 = (\mathbf{s}, \mathbf{s}, \mathbf{s})$  are NESPs.
- $\mathcal{P}(S_1) = (1.25, 6.75, 1.25)$ ,  $\mathcal{P}(S_2) = (1.25, 7.5, 1.25)$ .
- $\mathcal{P}(S_1) \leq \mathcal{P}(S_2)$ .

# The Two-Buyer Markets

- Arise in numerous scenarios: two firms (buyers) in a duopoly with a large number of suppliers (goods).
- Results:
  - ▶ All NESPs are symmetric and they are a union of at most  $2n$  convex sets.
  - ▶ The set of NESP payoffs constitute a PLC curve and all these payoffs are Pareto optimal.
  - ▶ A buyer gets the maximum NESP payoff when she imitates the other buyer.
  - ▶ There may exist NESPs, whose social welfare is larger than that of the Fisher payoff.
  - ▶ Behavior of prices - incentives.

# Complete Characterization of NESPs

## Lemma

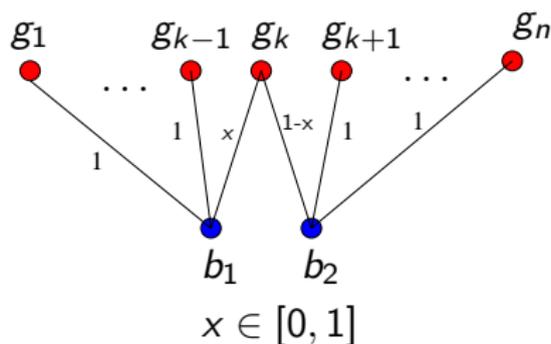
*All NESPs for a two-buyer market game are symmetric.*

- **Assumption:**  $\frac{u_{1j}}{u_{2j}} \geq \frac{u_{1(j+1)}}{u_{2(j+1)}}$ , for  $j = 1, \dots, n - 1$ .
- For a NESP  $S = (\mathbf{s}, \mathbf{s})$ , where  $\mathbf{s} = (s_1, \dots, s_n)$ .
  - ▶  $G(S)$  is a complete bipartite graph.
  - ▶  $(p_1, \dots, p_n) = \mathbf{p}(S)$ .
  - ▶  $m_1 + m_2 = \sum_{j=1}^n s_j = 1 \Rightarrow p_j = s_j, \forall j \in \mathcal{G}$ .
  - ▶ In a conflict-free allocation  $X \in \mathbb{X}(S)$ , if  $x_{1i} > 0$  and  $x_{2j} > 0$ , then clearly  $\frac{u_{1i}}{p_i} \geq \frac{u_{1j}}{p_j}$  and  $\frac{u_{2i}}{p_i} \leq \frac{u_{2j}}{p_j}$ .

# Nice Allocation

## Definition

An allocation  $X = [x_{ij}]$  is said to be a **nice allocation**, if it satisfies the property:  $x_{1i} > 0$  and  $x_{2j} > 0 \Rightarrow i \leq j$ .



## Lemma

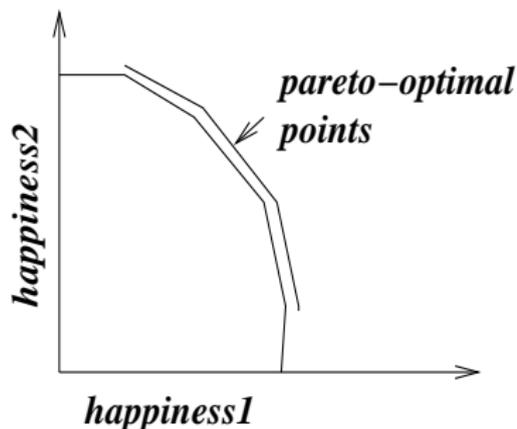
*Every NESP has a unique conflict-free nice allocation.*

# The Happiness Curve

- $\mathbb{F} = \{(\mathcal{P}_1(S), \mathcal{P}_2(S)) \mid S \in S^{NE}\}$  is the set of all possible NESP payoff tuples.

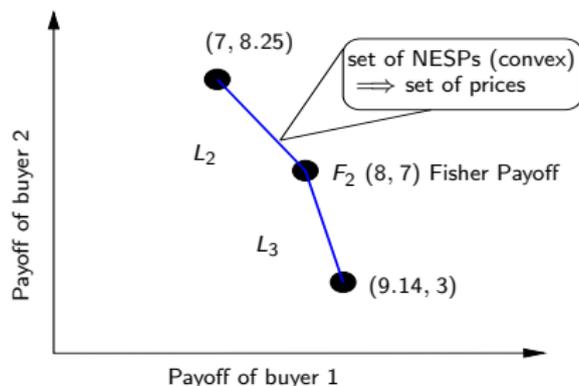
## Proposition

$\mathbb{F}$  is a piecewise linear concave curve.



## Example - Happiness Curve $\mathbb{F}$

Input:  $U = \begin{bmatrix} 6 & 2 & 2 \\ 0.5 & 2.5 & 7 \end{bmatrix}$ ,  $\mathbf{m} = \langle 7, 3 \rangle$ .

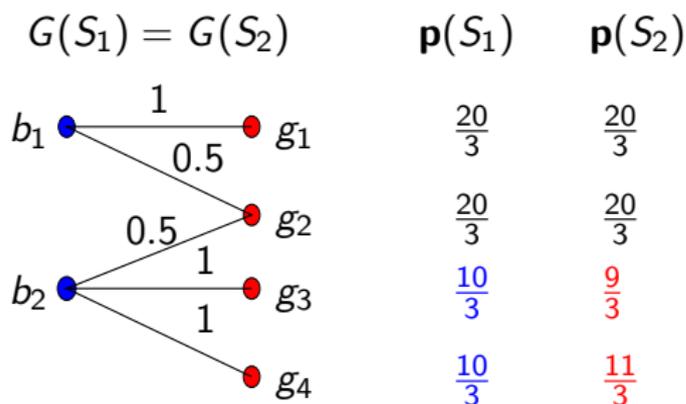


- $L_i$  corresponds to the sharing of good  $i$ .
- Social welfare from the Fisher payoff  $(8, 7)$  is lower than the payoff  $(7, 8.25)$  from the NESP  $S = (\mathbf{s}, \mathbf{s})$ , where  $\mathbf{s} = \langle 6, 2, 2 \rangle$ .

## Example - Incentives

Input:  $U = \begin{bmatrix} 4 & 3 & 2 & 1 \\ 1 & 2 & 3 & 4 \end{bmatrix}$ ,  $\mathbf{m} = \langle 10, 10 \rangle$ .

- $\mathbf{s}_1 = \langle \frac{20}{3}, \frac{20}{3}, \frac{10}{3}, \frac{10}{3} \rangle$ ,  $\mathbf{s}_2 = \langle \frac{20}{3}, \frac{20}{3}, \frac{9}{3}, \frac{11}{3} \rangle$ .
- $S_1 = (\mathbf{s}_1, \mathbf{s}_1)$ ,  $S_2 = (\mathbf{s}_2, \mathbf{s}_2)$ .



# Can Regulators Help?

**Question:** Is there a correlated equilibrium  $\pi$  such that the payoff w.r.t.  $\pi$  is liked by both the players?

## Proposition

*The correlated equilibrium cannot give better payoffs than every NE payoffs to all the buyers.*

# Srirang

**Srirang** is a cowherd from Gokul. He has a single cow. By god's grace:

- The cow gives **50 litres** of milk everyday.
- The expense of maintaining this cow is **Rs. 250** per day.

Srirang wishes to sell this milk. Every evening, Srirang gets **bids** from various parties. Each bid is of the form:

- Name of the bidder.
- The **price** at which he/she will purchase milk.
- The **volume** that he/she requires.

Looking at the bids, Srirang decides on a price for the next day, say **X**. This price is offered to all customers. The customers who can afford the price collect the milk and pay **Rs. X/litre**.

# Srirang

name	volume	price
roshni	5	20
radha	20	10
prema	15	8
neha	10	6
rukmi	10	5
gauri	10	3

He fixes a price of **Rs.5**. **Gauri** goes away. There is an overall demand of **60**. The others distribute the supply of **50 liters** somehow. Sriang earns **Rs. 250**.

# Srirang

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rukmi	10	5
gauri	10	3

He gets a bit greedy and fixes the price to **Rs. 8**.

Declared Price	8
Demand	40
Supply	40
Earnings	320

# Srirang and Siddhartha

- Two identical cows, each giving 25 liters, same *gopis*.
- Each *gopi* has an option to bid either at Srirang or at Siddhartha.

name	volume	price
roshni (5)	1	20
radha (20)	1	10
prema	15	8
neha	10	6
rukmi	10	5
gauri	10	3

- Game with *gopis* as the players and cowherd choice as the strategy.
- Standard NE is randomization.
- An **asymmetric** solution: Price at Sid is 10 and Price at Srirang is 6.
- rukmi and gauri go away.

## Market Segmentation!

Different prices for identical goods.

- Sid will differentiate and *add packaging*.

# The placement game

Facts! 70% placements over at IIT Bombay.

	M.Techs	Non M.Techs	Remarks
Total jobs	350	563	60% more
Total salary (crores)	31.4	66.7	
Average salary (lakhs)	8.97	11.84	32% more
Engg. and Tech* jobs	84	82	
E&T salary (crores)	5.97	6.37	
E&T average (lakhs)	7.1	7.7	8% more
E&T salary fraction	19%	9.5%	

\* E & T is as marked by HR/company/placement officer. Other categories are Finance, Analytics, FMCG, R&D, IT, Consultancy, Education, Services, NA, Others.

# The Stiglitz (1975) signalling game.

- Students with capabilities  $\theta_1 < \theta_2$ , known to students.
- Education system as a labelling agent paid for by society.
- Companies recruit based on label. Salary equals average firm productivity.
- Generally  $\theta_2$  wages rise *at the cost of*  $\theta_1$ .

**The Question** : Under what conditions would/should society pay for labelling?

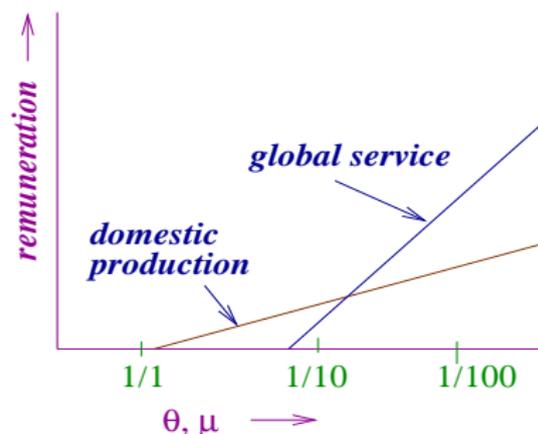
- The productivity of  $\theta_2$ -firm is non-linear and overall society wealth increases.
- Mechanisms exist to redistribute wealth created so that *everyone is better off*.
- **In India—both absent! Instead we have merit and transfer.**

## Even more complicating...

$\theta$ —societally relevant productive skills

$\mu$ —globally relevant service skills

$\mu \downarrow \theta \rightarrow$	1/1	1/10	1/100
1/1	<input type="checkbox"/>	<input type="checkbox"/>	
1/10	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
1/100		<input type="checkbox"/>	<input type="checkbox"/>



The case against *excessive merit*

- Huge labelling costs, borne by public. Subsidy to  $\mu$ -discovery!
- Need to orient curricula to domestic production.

# Conclusions

- **Markets**–Need to understand basic notions of *efficiency* and *equilibrium*
- *Unpack* consequences for society.
- Indian scenario poses many interesting situation.
  - ▶ FDI and agricultural supply chains.
  - ▶ Engineering placements.
  - ▶ NREGA–Rs. 30,000 crores. PDS.

Thanks!

# References



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