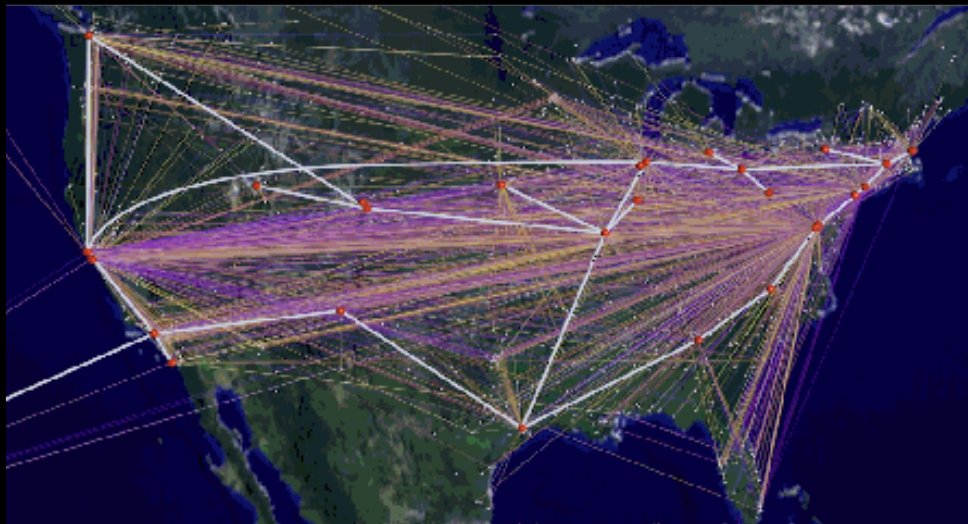


# 6.896: Topics in Algorithmic Game Theory

## Lecture 14

*Constantinos Daskalakis*

# Markets



# Exchange Market Model (without production)

Consider a marketplace with:

$n$  traders (or agents)

$k$  goods (or commodities)

assumed to be *infinitely divisible*

*Utility function* of trader  $i$ :

$$u_i : \mathcal{X}_i \subseteq \mathbb{R}_+^k \longrightarrow \mathbb{R}_+$$

non-negative reals

consumption set for trader  $i$

specifies trader  $i$ 's utility for bundles of goods

*Endowment* of trader  $i$ :

$$e_i \in \mathcal{X}_i$$

amount of goods trader comes to the marketplace with

# Exchange Market Model (without production)

Suppose the goods in the market are priced according to some price vector  $p \in \mathbb{R}_+^k$ .

Under this price vector, each trader would like to sell some of her endowment and purchase an optimal bundle using her income from what s/he sold; thus she solves the following program:

$$\left. \begin{array}{l} \max \quad u_i(x) \\ \text{s.t.} \quad p \cdot x \leq p \cdot e_i \\ \quad \quad x \in \mathcal{X}_i \end{array} \right\} \text{Program}_i(p)$$

**Note:** If  $u_i$  is continuous and  $\mathcal{X}_i$  is compact, then the above program has a well-defined optimum value.

# Competitive (or Walrasian) Market Equilibrium

**Def:** A price vector  $p \in \mathbb{R}_+^k$  is called a *competitive market equilibrium* iff there exists a collection of optimal solutions  $x_i(p)$  to  $\text{Program}_i(p)$ , for all  $i = 1, \dots, n$ , such that the total demand meets the total supply, i.e.

$$\underbrace{\sum_{i=1}^n x_i(p)}_{\text{total demand}} \leq \underbrace{\sum_{i=1}^n e_i}_{\text{total supply}}$$

# Arrow-Debreu Theorem 1954

**Theorem [Arrow-Debreu 1954]:** Suppose

(i)  $\mathcal{X}_i$  is closed and convex

(ii)  $e_i \gg 0$ , for all  $i$  (all coordinates positive)

(iii a)  $u_i$  is continuous

(iii b)  $u_i$  is quasi-concave

$$u_i(x) > u_i(y) \implies u_i(\lambda x + (1 - \lambda)y) > u_i(y), \forall \lambda \in (0, 1)$$

(iii c)  $u_i$  is nonsatiated

$$\forall y \in \mathcal{X}_i, \exists x \in \mathcal{X}_i \text{ s.t. } u_i(x) > u_i(y)$$

Then a competitive market equilibrium exists.

# Market Clearing

Nonsatiation + quasi-concavity

- at equilibrium every trader spends all her budget, i.e. if  $x_i(p)$  is an optimal solution to  $\text{Program}_i(p)$  then

$$p \cdot x_i(p) = p \cdot e_i$$

$$\implies p \cdot \left( \sum_i x_i(p) - \sum_i e_i \right) = 0$$

- every good with positive price is fully consumed

# A market with no equilibrium

Alice has oranges and apples, but only wants apples.

Bob only has oranges, but only wants both oranges and apples.

- if oranges are priced at 0, then Bob's demand is not well-defined.

- if oranges are priced at  $> 0$ , then Alice wants more apples than there are in the market.



# Proof of the Arrow-Debreu Theorem

Steps (details on the board)

**simplifying assumption:**  $u_i$  is strictly concave

(i) w.l.o.g. can assume that the  $\mathcal{X}_i$  are compact

└── argument on the board; the idea is that we can replace  $\mathcal{X}_i$  with

$\mathcal{X}_i \cap \left\{ x \leq \sum_i e_i \right\}$  without missing any equilibrium, and  
without introducing spurious ones

(ii) **by compactness and strict concavity:**

for all  $p$ , there exists a unique maximizer  $x_i(p)$  of  $\text{Program}_i(p)$

(iii) **by the maximum theorem:**  $x_i(p)$  is continuous on  $p$

(iv) *rest of the argument on the board*

# Utility Functions

Linear utility function (goods are perfect substitutes)

$$u_i(x) = \sum_j a_{ij} x_j$$

Leontief (or fixed-proportion) utility function

$$u_i(x) = \min_j \{a_{ij} x_j\}$$

e.g. buying ingredients to make a cake

e.g. rate allocation on a network

Cobb-Douglas utility function

$$u_i(x) = \prod_j x_j^{a_{ij}}, \quad \text{where } \sum_j a_{ij} = 1$$

# Utility Functions

CES utility functions:

$$u_i(x) = \left( \sum_j u_{ij} \cdot x_j^\rho \right)^{\frac{1}{\rho}}, \quad -\infty < \rho \leq 1$$

**Convention:** - If  $u_{ij}=0$ , then the corresponding term in the utility function is always 0.  
- If  $u_{ij} > 0$ ,  $x_j=0$ , and  $\rho < 0$ , then  $u_i(x)=0$  no matter what the other  $x_j$ 's are.

$\rho = 1$   linear utility form

$\rho \rightarrow -\infty$   Leontief utility form

$\rho \rightarrow 0$   Cobb-Douglas form

*elasticity of substitution:*  $\sigma = \frac{1}{1 - \rho}$

# Homework

CES utility functions:

$$u_i(x) = \left( \sum_j u_{ij} \cdot x_j^\rho \right)^{\frac{1}{\rho}}, \quad -\infty < \rho \leq 1$$

*show it is concave (2 points)*

# Fisher's Model

Suppose all endowment vectors are parallel...

$$e_i = m_i \cdot e, \quad m_i > 0, \quad m_i : \text{scalar}, e : \text{vector}$$

→ relative incomes of the traders are independent of the prices.

Equivalently, we can imagine the following situation:

$n$  traders, with specified money  $m_i$

$k$  divisible goods owned by seller; seller has  $q_j$  units of good  $j$

Arrow-Debreu Thm →

(under the Arrow-Debreu conditions) there exist prices that the seller can assign on the goods so that the traders spend all their money to buy optimal bundles and supply meets demand

# Fisher's Model with CES utility functions

$$u_i(x_i) = \left( \sum_j u_{ij} \cdot x_{ij}^\rho \right)^{\frac{1}{\rho}}, \quad -\infty < \rho \leq 1$$

- Buyers' optimization program (under price vector  $p$ ):

$$\begin{aligned} & \max u_i(x_i) \\ \text{s.t.} \quad & \sum_j x_{ij} p_j \leq m_i \end{aligned}$$

- Global Constraint:

$$\begin{aligned} \sum_i x_{ij} & \leq q_j, \quad \forall j \\ x_{ij} & \geq 0, \quad \forall j \end{aligned}$$

# Eisenberg-Gale's Convex Program

- The space of feasible allocations is:

$$\sum_i x_{ij} \leq q_j, \quad \forall j$$
$$x_{ij} \geq 0, \quad \forall j$$

- But how do we aggregate the trader's optimization problems into one global optimization problem?

e.g., choosing as a global objective function the sum of the traders' utility functions won't work...

# Eisenberg-Gale's Convex Program

**Observation:** The global optimization problem should not favor (or punish) Buyer  $i$  should he

- Doubled all her  $u_{ij}$ 's
- Split himself into two buyers with half the money
- **Eisenberg and Gale's idea:** Use the following objective function (take its logarithm to convert into a concave function)

$$\max \quad u_1(x_1)^{m_1} \cdot u_2(x_2)^{m_2} \cdot \dots \cdot u_n(x_n)^{m_n}$$



# Eisenberg-Gale's Convex Program

$$\begin{aligned} \max \quad & u_1^{m_1} \cdot u_2^{m_2} \cdot \dots \cdot u_n^{m_n} \\ \text{s.t} \quad & u_i = \left( \sum_j u_{ij} x_{ij}^\rho \right)^{\frac{1}{\rho}} \\ & \sum_i x_{ij} \leq q_j \\ & x_{ij} \geq 0 \end{aligned}$$

Remarks:

- No budgets constraint!
- It is not necessary that the utility functions are CES; everything works as long as they are concave, and homogeneous

# Eisenberg-Gale's Convex Program

KKT Conditions →

- interpret Lagrange multipliers as prices
- primal variables + Lagrange multipliers comprise a competitive eq.

1. Gives a poly-time algorithm for computing a market equilibrium in Fisher's model.
2. At the same time provides a proof that a market equilibrium exists in this model.

**Homework (2 points):** Show 1, 2 for linear utility functions.