

## Market equilibrium or market clearance price:

is a market price established through competition such that the amounts of goods or services sought by buyers is equal to the amount of goods or services produced by **sellers**. The prices will **not** change unless demand or supply changes.

More precisely in a Fisher setting with linear utilities we have

-  $m$  buyers (each with budget  $B_i$ ) and  $n$  goods for sale (each with quantity  $q_j$ )

- Each buyer has linear utility  $u_{ij}$ , i.e. utility of  $i$  is  $\sum_j u_{ij} x_{ij}$  where  $u_{ij} \geq 0$  is the utility of buyer  $i$  for good  $j$  and  $x_{ij}$  is the amount of good  $j$  bought by  $i$ .

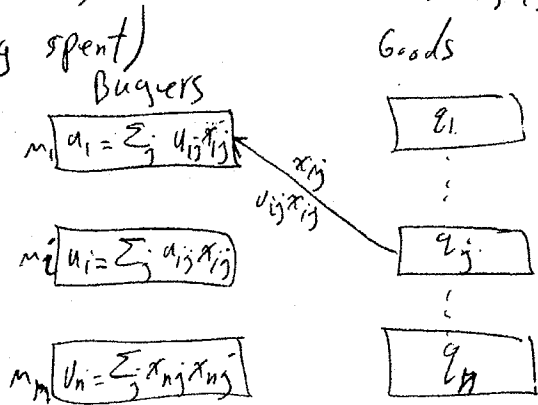
A market equilibrium or market clearance is a price vector  $p$  that

- maximizes utility  $\sum_j u_{ij} x_{ij}$  of buyer  $i$  subject to his budget

$$\sum_j p_j x_{ij} \leq B_i$$

- The demand and supply for each good  $j$  are equal, i.e.,  $\sum_i x_{ij} = q_j$  (and thus the budgets are totally spent)

Thm. A Under the mild assumption that each good has a potential buyer, i.e. a buyer who derives nonzero utility from this good, market clearing prices do exist always.



## Arrow-Debreu model with linear utilities:

It is also known as the Walrasian model of the exchange model and it generalizes Fisher's model. Consider a market consisting of a set  $B$  of agents and a set  $G$  of goods, assume  $|G| = n$  and  $|B| = m$ . Each agent  $i$  comes to the market with an initial endowment of goods  $e_i = (e_{i1}, e_{i2}, \dots, e_{in})$ . We may assume w.l.o.g. that the total amount of each good is unit (by scaling), i.e. for  $1 \leq j \leq n$ ,  $\sum_{i=1}^m e_{ij} = 1$ . Each agent has linear utilities for these goods. The utility of agent  $i$  on deriving  $x_{ij}$  amount of good  $j$  for  $1 \leq j \leq n$  is  $\sum_{j=1}^n u_{ij} x_{ij}$ . The problem is to find prices for goods  $p = (p_1, \dots, p_n)$  so that if each agent sells

her initial endowment at these prices and buys her optimal bundle, the market clears, i.e., there is no deficiency or surplus at any good. An agent may have more than one optimal bundle; we will assume that we are free to give each agent any optimal bundle to meet the market clearing condition.

Note Fisher is a special case of Arrow-Debreu,  $m+1$  goods and  $m+1$  agents. Assume money is the  $m+1$ st good and for the first  $m$  agents corresponds to the  $m$  buyers whose initial endowment is the money and the  $m+1$  agent's initial endowment is all  $m$  goods. The first  $m$  agents have utilities for goods, as given by the Fisher market and no utility for money whereas the  $m+1$ st agent has utility for money (by scaling we can assume price of money = 1).

Thus there exists a market clearance prices in the Arrow-Debreu model and indeed it is unique.

See some ideas of the proof in the wireless network setting and more generally THM A

Proof of THM A: First we observe that w.l.o.g. each  $q_{ij} = 1$ , by scaling the  $u_{ij}$ 's appropriately.  $u_{ij}$  and  $B_i$  are in general rational; again by scaling appropriately, we can assume they are integral.

Again similar to non-atomic selfish routing, we show equil. allocations for Fisher's linear case are indeed optimal solutions to a remarkable convex program, called the Eisenberg-Gale convex program.

The objective function in this program is not very intuitive though there are some evidence for it. The objective is

$$\max \left( \prod_{i \in B} u_i^{B_i} \right)$$
 in some sense for each buyer  $i$  is  $u_i^{B_i}$  is increased if  $u_i$  or  $B_i$  is increased. However we want buyers with larger  $B_i$  have higher effect in the system.

(See the paper by Kamal Jain in FOCS 04 for more intuition)

Exercise: Think more about this objective function

The log is used in Eisenberg-Gale convex prog.

Note that instead of  $\max f(x)$  we can  $\min -f(x)$ , where  $-f(x)$  is convex.

$$\begin{aligned} \max \sum_{i \in B} B_i \log u_i \\ \text{s.t. } u_i &= \sum_{j \in G} u_{ij} x_{ij} \quad \forall i \in B \\ \sum_{i \in B} x_{ij} &\leq 1 \quad \forall j \in G \\ x_{ij} &\geq 0 \quad \forall i \in B, j \in G. \end{aligned}$$

Note convex program  $\min$  convex s.t. convex body (there is linear indeed)

using Karush, Kuhn, Tucker (KKT) conditions which are essentially the generalization of duality theory for linear programming, we know that optimal solutions (and complementarily slackness conditions)

to  $x_{ij}$  and  $P_j$  must satisfy the following: (here  $P_j$ 's are dual variables) corresponding to second set of conditions

i)  $\forall j \in G; P_j \geq 0$

ii)  $\forall j \in G: P_j > 0 \Rightarrow \sum_{i \in B} x_{ij} = 1$

iii)  $\forall i \in B, \forall j \in G: \frac{u_{ij}}{P_j} \leq \frac{\sum_{j \in G} u_{ij} x_{ij}}{B_i}$  (makes sure the good purchased by  $i$  by spending  $B_i$  has the highest utility, otherwise buy  $j$  more)

iv)  $\forall i \in B, \forall j \in G: x_{ij} > 0 \Rightarrow \frac{u_{ij}}{P_j} = \frac{\sum_{j \in G} u_{ij} x_{ij}}{B_i}$

Thm: For the linear case of Fisher's Model:

a) If each Good has a potential buyer, equil. exists.

b) ~~The~~ set of equil allocations is convex

c) Equil utilities and prices are unique.

Proof: we set price of good  $j$ ,  $P_j$ . since for good  $j$ , there is buyer  $i$  with  $u_{ij} > 0$ , by (iii)  $P_j \geq \frac{B_i u_{ij}}{\sum_{j \in G} u_{ij} x_{ij}} > 0$ .

Thus by (ii),  $\sum_{i \in B} x_{ij} = 1$  and all goods are fully sold (their prices are positive also).

iii) and iv) imply that if buyer  $i$  gets good  $j$  then  $j$  must be among the goods that give buyer  $i$  maximum utility per unit money spent at current prices. (i.e.  $x_{ij} > 0$ )

Hence each buyer gets only a bundle consisting of her most desired goods, i.e. an optimal bundle.

By (iv),  $\frac{u_{ij}}{P_j} x_{ij} = \frac{\sum_{j \in G} u_{ij} x_{ij}}{B_i} x_{ij}$  to handle the case of  $x_{ij} = 0$

sum over all  $j$ :  $B_i \frac{\sum_{j \in G} u_{ij} x_{ij}}{\sum_{j \in G} u_{ij} x_{ij}} = \sum_{j \in G} P_j x_{ij} \Rightarrow \frac{B_i u_{ij} x_{ij}}{\sum_{j \in G} u_{ij} x_{ij}} = P_j x_{ij}$

money of each buyer is fully spent. This complete the proof of (a).

- Since each equil allocation is an optimal solution to the Eisenberg-Gale

- convex Program, the set of allocations must form a convex set, thus we have

- since log is strictly concave, similar to non-atomic selfish routing, if there is more than one equil, the utility by each buyer should be the same and this with (iv) gives unique equil. prices. Thus we have (c) also. (6)