

# Constrained Uni /Multi- Objective Decision Making in Economics

# Topics

- A Consumer's choice Problem (Utility Maximization)
- Life's Optimization Problem
- Air Travel choice Problem
- Efficiency vs Equity

# Consumer Behaviour



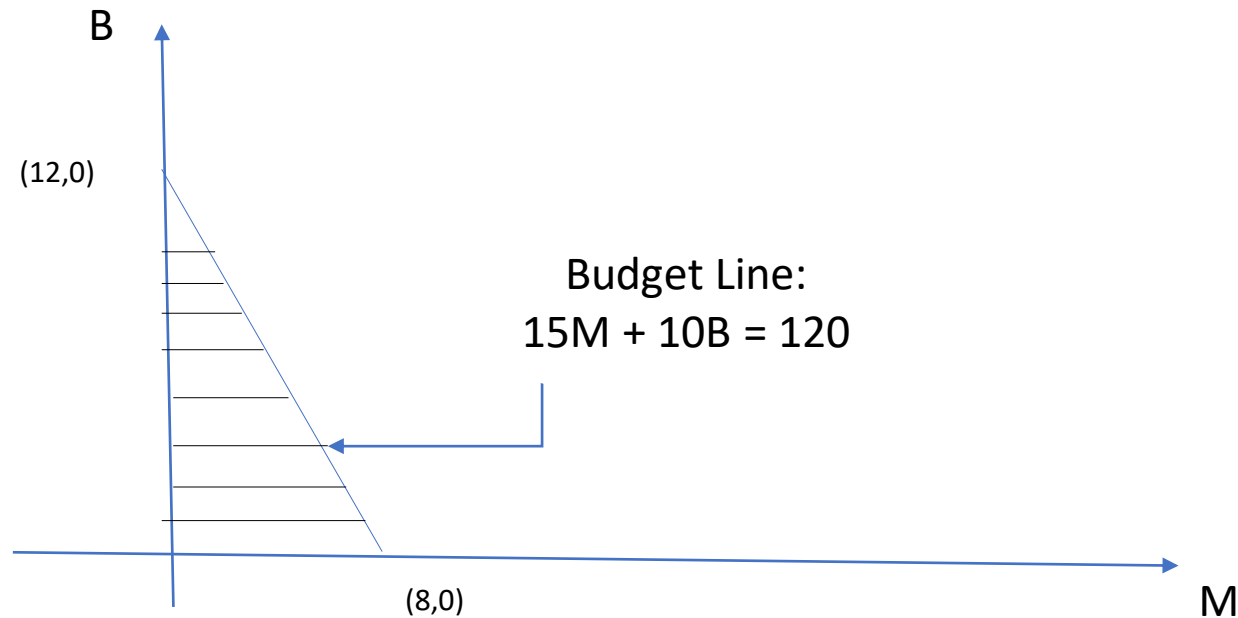
# A Consumer's choice Problem

- Two consumable items: Banana & Mango
- Price of 1 Banana = Rs. 10
- Price of 1 Mango = Rs. 15
- Consumer has Rs. 120
- How should he/she allocate money between Mangoes & Bananas?
- Depends on his taste...what he loves...& How much...Right??
- The consumers taste is represented by a Utility Function  $U: R^2 \rightarrow R$
- $\max_{M,B} U(M, B) : \text{subject to the constraint } 15M + 10B \leq 120$

# *Consumer's Optimization Problem*

- Decision variables:  $M \in R_+$  &  $B \in R_+$
- Objective function:  $U(M,B)$
- Constraint:  $15M + 10B \leq 120$


# Budget Set



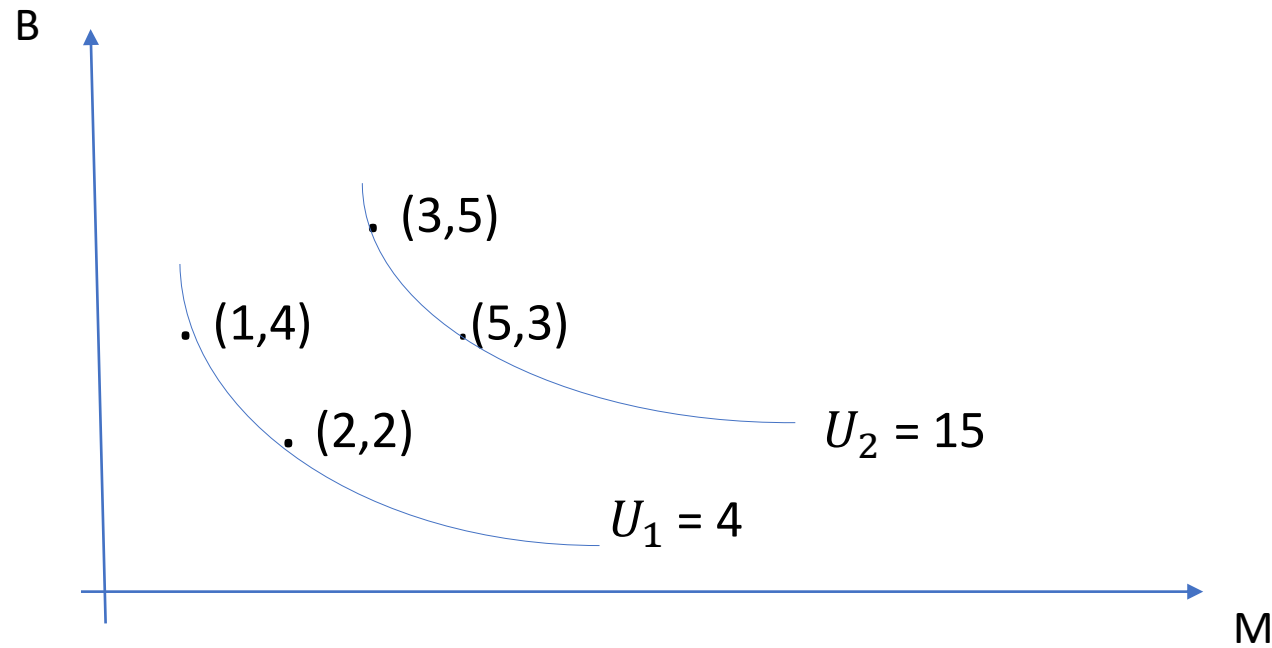
All  $(M,B) \in$ 


 are affordable bundles.

# Example

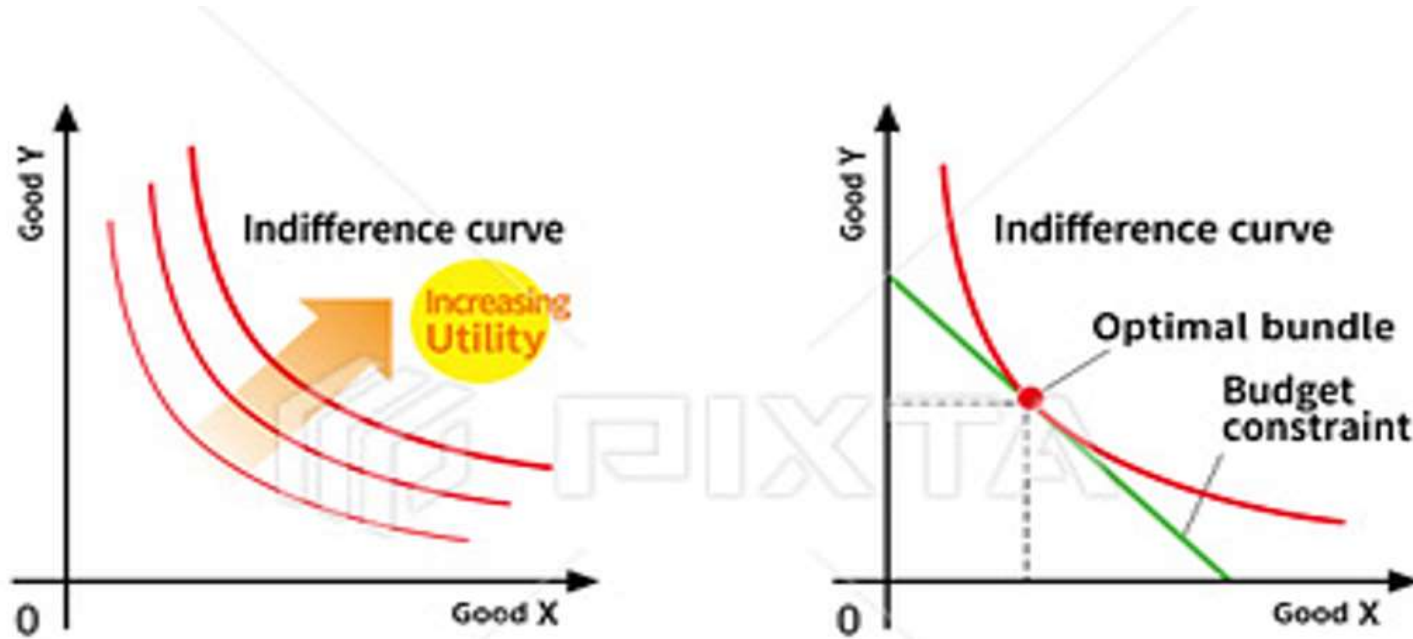
- $U(M,B) = M.B$
- $\max_{M,B} U(M,B) = M.B$  : subject to the constraint  $15M + 10B \leq 120$
- i.e  $\max_{M,B} U(M,B) = M.B$  such that  $(M,B) \in$  

# Indifference curves: $U(M,B) = M.B$





# Optimal Choice / Optimal Bundle



Indifference curve and Budget constraint

# Optimization Problem - Revised

- $\max_{M,B} U(M, B) = M \cdot B$  : subject to the constraint  $15M + 10B = 120$
- $\equiv \max_{M,B} U(M, B) = M \cdot B$  : subject to the constraint  $B = (24 - 3M)/2$
- $\equiv \max_M M(24 - 3M)$
- $M^* = 4$  & therefore  $B^* = 6$
- $(M^*, B^*) = (4, 6)$  is the optimal bundle.

# Practice Problems

- $U(M,B) = M^2 + B^2$
- $U(M,B) = \min \{M,B\}$ . (e.g left shoe & right shoe)
- $U(M,B) =$

# Plan a Great Life



# The Problem

- Suppose you will be alive for  $T+1$  years (starting from your Grad. Day)
- Let's say you know that in year 'n' you will make income =  $y_n$
- Each year you can save =  $s_n$  & consume =  $c_n$
- Interest rate =  $r$  (remains constant throughout life)
- Consumption in youth “feels better” than in Old Age.
- World with 100 % inheritance tax ☺... No Dad's money !!!!
- $\max_{c_0, c_1, \dots, c_T} \sum_{n=0}^T [f(n) \cdot (\log_e c_n)]$  ;  $f(n)$  is the depreciation function.  $f(n)$  is decreasing in 'n'

# The Periodic Budget Constraints

- $c_0 = y_0 - s_0$

- $c_1 = y_1 + s_0(1 + r) - s_1$

- $c_2 = y_2 + s_1(1 + r) - s_2$

- $c_3 = y_3 + s_2(1 + r) - s_3$

.....

- $c_{T-1} = y_{T-1} + s_{T-2}(1 + r) - s_{T-1}$

- $c_T = y_T + s_{T-1}(1 + r)$

# The Periodic Budget Constraints

- $c_0 = y_0 - s_0$

- $c_1 = y_1 + s_0(1 + r) - s_1$

- $c_2 = y_2 + s_1(1 + r) - s_2$

- $c_3 = y_3 + s_2(1 + r) - s_3$

.....

- $c_{T-1} = y_{T-1} + s_{T-2}(1 + r) - s_{T-1}$

- $c_T = y_T + s_{T-1}(1 + r)$

$$: c_0 = y_0 - s_0$$

$$: \frac{c_1}{1+r} = \frac{y_1}{1+r} + s_0 - \frac{s_1}{1+r}$$

$$: \frac{c_2}{(1+r)^2} = \frac{y_2}{(1+r)^2} + \frac{s_1}{1+r} - \frac{s_2}{(1+r)^2}$$

$$: \frac{c_3}{(1+r)^3} = \frac{y_3}{(1+r)^3} + \frac{s_2}{(1+r)^2} - \frac{s_3}{(1+r)^3}$$

.....

$$: \frac{c_{T-1}}{(1+r)^{T-1}} = \frac{y_{T-1}}{(1+r)^{T-1}} + \frac{s_{T-2}}{(1+r)^{T-2}} - \frac{s_{T-1}}{(1+r)^{T-1}}$$

$$: \frac{c_T}{(1+r)^T} = \frac{y_T}{(1+r)^T} + \frac{s_{T-1}}{(1+r)^{T-1}}$$

# The Consolidated Budget Constraint

$$c_0 + \frac{c_1}{1+r} + \frac{c_2}{(1+r)^2} + \frac{c_3}{(1+r)^3} \dots\dots + \frac{c_{T-1}}{(1+r)^{T-1}} + \frac{c_T}{(1+r)^T}$$
$$= y_0 + \frac{y_1}{1+r} + \frac{y_2}{(1+r)^2} + \frac{y_3}{(1+r)^3} \dots\dots + \frac{y_{T-1}}{(1+r)^{T-1}} + \frac{y_T}{(1+r)^T}$$



# Life's Optimization Problem

$$\max_{c_0, c_1, \dots, c_T} \sum_{n=0}^T [f(n) \cdot (\log_e c_n)]$$

Subject to the constraints:

$$\sum_{n=0}^T \frac{c_n}{(1+r)^n} = \sum_{n=0}^T \frac{y_n}{(1+r)^n}$$

$$c_n \geq 0 \quad \forall n = 0, 1, 2, \dots, T$$

# Let's get real !!

- You don't know what my lifetime income stream  $\{y_0, y_1, y_2, \dots, y_T\}$
- What is the depreciation function  $f(n)$  for you??
- Will the interest rate remain same all the while?
- Won't you invest in other asset classes?

# Depreciation function

- Typically  $f(n) = \beta^n \forall n = 0, 1 \dots T$  &  $\beta \in (0, 1)$
- Lower the  $\beta$  lesser value you assign to future: MYOPIC
- Higher the  $\beta$  higher value you assign to the future: FAR - SIGHTED
- Of course you can have other functional forms too for  $f(n)$
- Depends on your personality type !!

# Income Estimation

- Let's say life starts at 35 ☺
- From your grad day to the time you turn 35 let's say your annual incomes are given by  $\{y_0, y_1, y_2, \dots, y_{14}\}$
- Fit the model on the data:  $\{y_0, y_1, y_2, \dots, y_{14}\}$  & income streams of other individuals
- Get estimates:  $\widehat{y}_{15}, \widehat{y}_{16}, \dots, \widehat{y}_T$
- Define  $\widetilde{y}_n = \widehat{y}_{n+15}$  (\*  $\widetilde{y}_0 = \widehat{y}_{15} + \bar{\bar{S}}$ ;  $\bar{\bar{S}}$  = savings till age 35)
- So your annual income flow from age 35 is given by:  
 $\{\widetilde{y}_0, \widetilde{y}_1, \dots, \widetilde{y}_{T'}\}$ ;  $T' = T - 15$

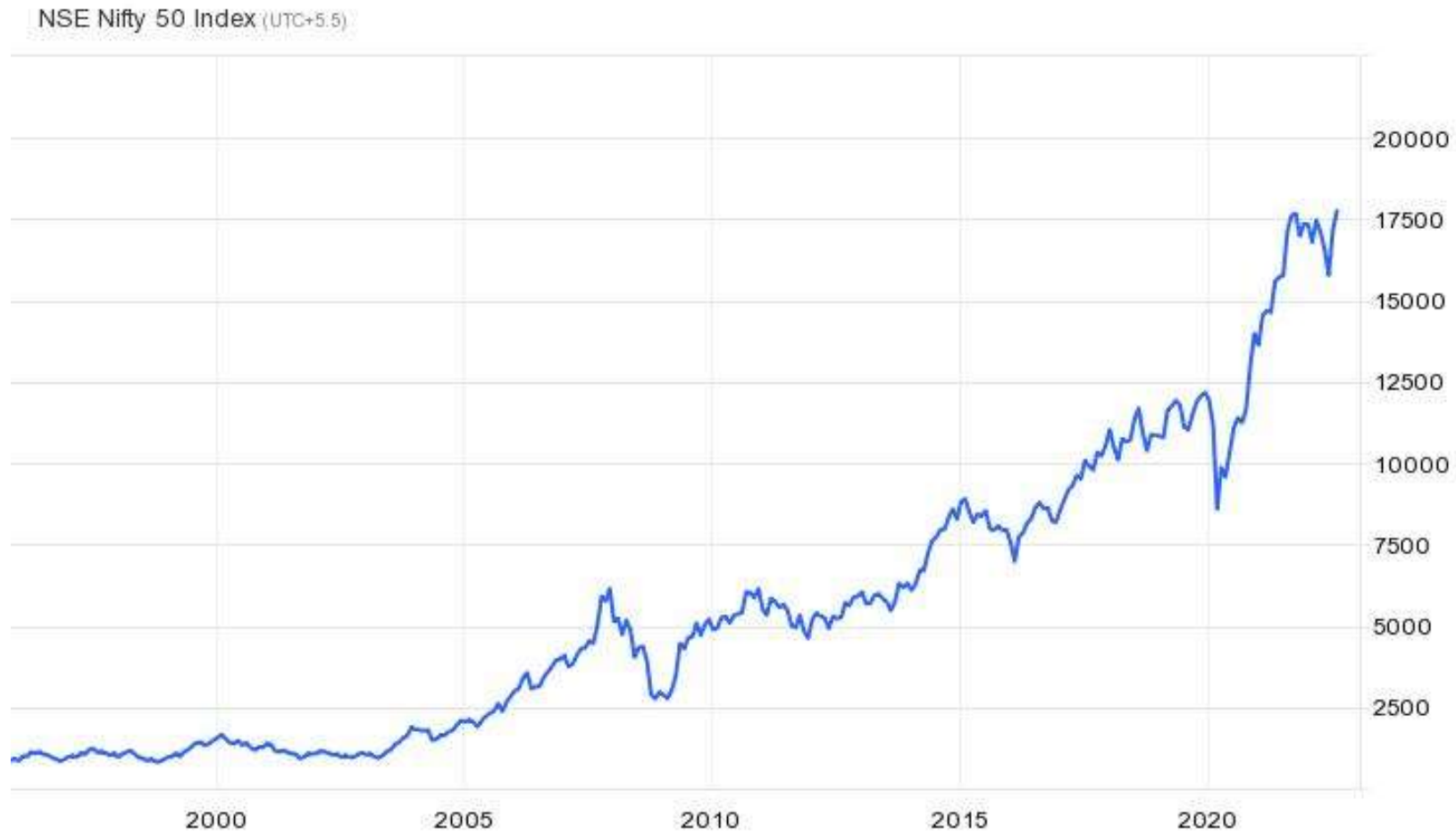
# Sensex



# Nominal Int. rate (savings)



# NIFTY 50



# Investment Returns

- CAGR of Sensex (1979 – 2019) -> 16.1%
- CAGR of NIFTY 50 (2001 – 2021) -> 14%
- Avg. interest rate (going forward) -> 6%
- Constant Portfolio:  $\gamma_1$  % in Sensex fund  
 $\gamma_2$  % in NIFTY 50  
 $(1 - \gamma_1 - \gamma_2)$  % in FD / savings A/c
- $r = 16.1 \gamma_1 + 14 \gamma_2 + 6 (1 - \gamma_1 - \gamma_2)$



# Life's Optimization Problem (at 35 !)

$$\max_{c_0, c_1, \dots, c_{T'}} \sum_{n=0}^{T'} [f(n) \cdot (\log_e c_n)]$$

Subject to the constraints:

$$\sum_{n=0}^{T'} \frac{c_n}{(1+r)^n} = \sum_{n=0}^{T'} \frac{\widetilde{y}_n}{(1+r)^n}$$

$$c_n \geq 0 \quad \forall n = 0, 1, 2, \dots, T'$$

- Solving the optimization problem yields optimal periodic consumptions  $(c_0^*, c_1^*, c_2^* \dots c_{T'}^*)$
- $\sum_{n=0}^{T'} [f(n) \cdot (\log_e c_n^*)] = V^*$  (The optimal utility)
- $V^*(\gamma_1, \gamma_2, T')$
- Given that you know  $T'$ , maximize  $V^*(\gamma_1, \gamma_2, T')$  w.r.t  $\gamma_1$  &  $\gamma_2$

# Let's Fly !! (Multi – Objective Choice)



# Kolkata → Delhi

AIRLINE	TIME (Hrs)	COST (Rs. '000)
INDIGO	2	8
SPICE JET	3	6
Go AIR	3	8
AIR INDIA	4	5
VISTARA	4	7
AIR ASIA	5	5
JET AIRWAYS	5	6
AKASA	5	7
KINGFISHER	6	7

# Optimization Problem

- Decision Variable: **Airline**  $\in$  {Indigo , SpiceJet, GoAir, Air India, Vistara, Air Asia, Jet Airways, Akasa, Kingfisher}
- Here the consumer / buyer has two objectives.
  - i. Minimize cost
  - ii. Minimize Time (of travel)
- Let's assume for the time being that your bank a/c balance  $>$  Rs. 8000  
i.e no budget constraint.

Let's NOT be DUMB !



# Indigo vs GoAir

AIRLINE	TIME (Hrs)	COST (Rs. '000)
INDIGO	2	8
SPICE JET	3	6
Go AIR	3	8
AIR INDIA	4	5
VISTARA	4	7
AIR ASIA	5	4
JET AIRWAYS	5	6
AKASA	5	7
KINGFISHER	6	7

# Air India vs Vistara

AIRLINE	TIME (Hrs)	COST (Rs. '000)
INDIGO	2	8
SPICE JET	3	6
Go AIR	3	8
AIR INDIA	4	5
VISTARA	4	7
AIR ASIA	5	4
JET AIRWAYS	5	6
AKASA	5	7
KINGFISHER	6	7



# Air Asia vs {Jet Airways, Akasa, Kingfisher}

AIRLINE	TIME (Hrs)	COST (Rs. '000)
INDIGO	2	8
SPICE JET	3	6
Go AIR	3	8
AIR INDIA	4	5
VISTARA	4	7
AIR ASIA	5	4
JET AIRWAYS	5	6
AKASA	5	7
KINGFISHER	6	7

# Re-Inspecting the “Smart” Choices

AIRLINE	TIME (Hrs)	COST (Rs. '000)
INDIGO	2	8
SPICE JET	3	6
AIR INDIA	4	5
AIR ASIA	5	4

# Pareto Optimal Set

- {INDIGO , SPICEJET , AIR INDIA , AIR ASIA} form a pareto optimal set.
- In this set moving from one Airline to another will NOT lead to an improvement in one objective function without incurring a loss in the other objective function.
- Pareto Optimal Set is also called Dominant Set of Rank -1.

# Re-Inspecting the “DUMB” choices

AIRLINE	TIME (Hrs)	COST (Rs. '000)
Go AIR	3	8
VISTARA	4	7
JET AIRWAYS	5	6
AKASA	5	7
KINGFISHER	6	7

# Vistara vs {Akasa, Kingfisher}

AIRLINE	TIME (Hrs)	COST (Rs. '000)
Go AIR	3	8
VISTARA	4	7
JET AIRWAYS	5	6
AKASA	5	7
KINGFISHER	6	7

# Dominant Set of Rank-2

- {Go AIR, VISTARA, JET AIRWAYS} form a dominant set of Rank -2
- Within this set moving from one Airline to another will NOT lead to an improvement in one objective function without incurring a loss in the other objective function.

# {Akasa, Kingfisher}

- Akasa dominates Kingfisher.
- Dominant set of Rank -3 = {Akasa}
- Dominant set of Rank -4 = {Kingfisher}

# The Hierarchy of Choice

- DSR-1 -> “SMART” (pareto optimal)
- DSR-2 -> “DUMB”
- DSR - 3 -> “DUMBER”
- DSR – 4 -> “DUMBEST”



# Constraints

- The consumer might face two kinds of constraints:
  - i. Budget constraint
  - ii. Time constraint
- A consumer might have either one of them or both.
- the constraints determine the set of feasible alternatives.

# Constraint Example 1: Budget = Rs. 6500

- The feasible set of alternatives are:

AIRLINE	TIME (Hrs)	COST (Rs. '000)
SPICE JET	3	6
AIR INDIA	4	5
AIR ASIA	5	4
JET AIRWAYS	5	6

- The Pareto Optimal (DSR -1) set: {SPICE JET, AIR INDIA, AIR ASIA}
- DSR -2: { JET AIRWAYS}

# Movie Time !!



# Two Competing Theatres

- Two Movie Theatres (of same quality) in a neighbourhood.
- Total market size (per annum) = Rs. 1 Cr.
- Marketing budget of theatre 1 = Rs. 1 L & that of Theatre – 2 is Rs 2 L.
- Then Theatre 1 grabs  $\frac{1}{3}$  of the market size & Theatre 2 grabs  $\frac{2}{3}$ .
- Market share is proportional to the marketing budget.

- If the marketing budget of firm  $j$  is  $= X_j$  where  $j \in \{1,2\}$

- Then the market share of firm  $j$  is given by

$$\begin{aligned}\pi_j &= \frac{X_j}{X_1+X_2} \text{ if } X_j > 0 \text{ \& } X_i > 0 \\ &= 1 \quad \text{if } X_j > 0 \text{ \& } X_i = 0 \\ &= 0 \quad \text{if } X_j = 0 \text{ \& } X_i > 0\end{aligned}$$

$$\pi_i = \pi_j = 0 \quad \text{if } X_j = 0 \text{ \& } X_i = 0$$

# Herfindahl Hirschman Index (HHI) – Inequality Measure

- Given that the total market size is = 1, if firm  $j \in \{1, 2, \dots, N\}$  grabs a market share =  $\pi_j$  then  $HHI = \sum_{j=1}^N \pi_j^2$ .
- Clearly HHI is minimum if  $\pi_j = 1/N$  (all firms grab equal share)
- HHI is maximum (=1) if  $\pi_j = 1$  for some  $j$  (monopoly)
- In the example:  $HHI = (1/3)^2 + (2/3)^2 = 5/9$

# A Network of Contests

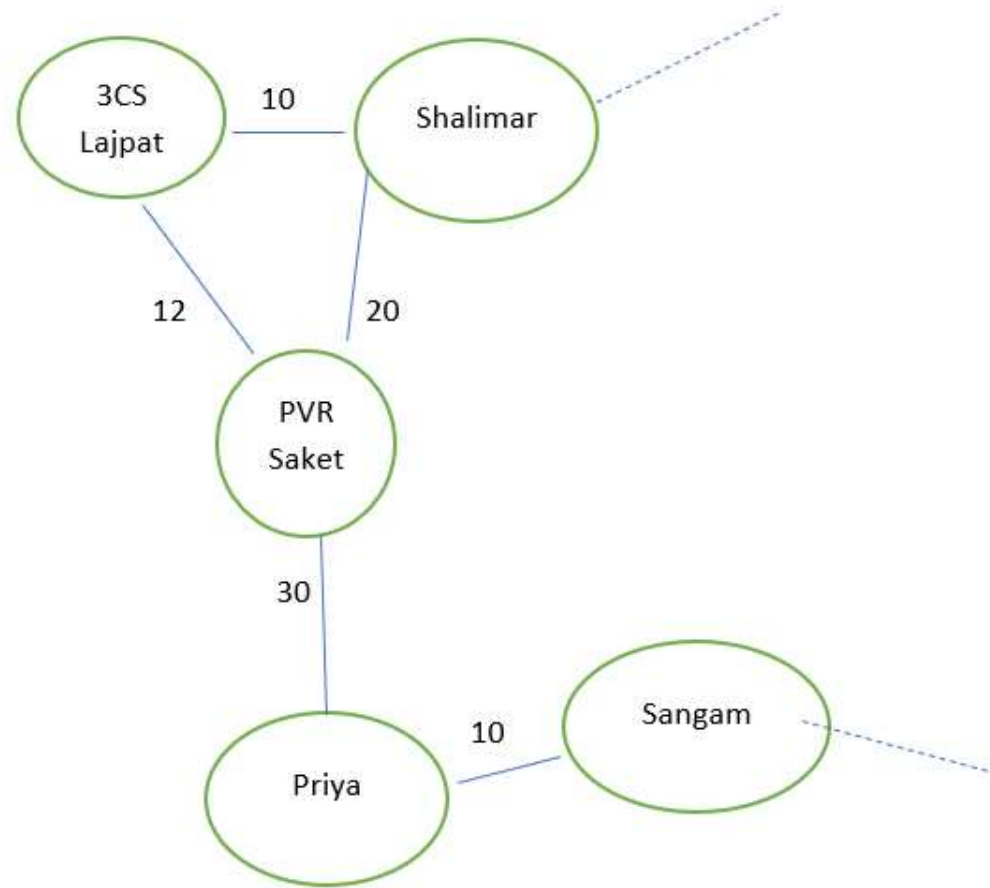


# DELHI

## CINEMA HALLS



# Graphical Representation



# *Objective of every Theatre (Agent)*

- Maximize their own market share – the “prize”
- They allocate – the marketing budget.
- Distribution mechanism – Tullock Contest (1980)

# *Model*

- $S$ : set of agents (firms), who are engaged in a network of conflicts (for market share).



# Model

- $S$ : set of agents (firms), who are engaged in a network of conflicts (for market share).
- This is represented by a weighted undirected graph  $G = \langle V, E, W \rangle$ , where  $V$ , the set of vertices denote the agents (firms) and the edge  $e_{ij} \in E$  denotes that agent 'i' is contesting with agent j.

# Model

- $S$ : set of agents (firms), who are engaged in a network of conflicts (for market share).
- This is represented by a weighted undirected graph  $G = \langle V, E, W \rangle$ , where  $V$ , the set of vertices denote the agents (firms) and the edge  $e_{ij} \in E$  denotes that agent 'i' is contesting with agent j.
- $W(e_{ij}) = w_{ij}$  i.e the weight on the edge connecting agent i & j signifies the common valuation of the prize which the two agents are fighting over.  $w_{ij}$  is the market size firms i & j are contesting over.
- Of course  $W(e_{ij}) = 0$  if  $e_{ij} \notin E$ .

# Model

- $S$ : set of agents (firms), who are engaged in a network of conflicts (for market share).
- This is represented by a weighted undirected graph  $G = \langle V, E, W \rangle$ , where  $V$ , the set of vertices denote the agents (firms) and the edge  $e_{ij} \in E$  denotes that agent 'i' is contesting with agent j.
- $W(e_{ij}) = w_{ij}$  i.e the weight on the edge connecting agent i & j signifies the common valuation of the prize which the two agents are fighting over.  $w_{ij}$  is the market size firms i & j are contesting over.
- Of course  $W(e_{ij}) = 0$  if  $e_{ij} \notin E$ .
- Also each agent  $i \in S$  has "arms" endowment  $\bar{X}_i$  (marketing budget of firm i).

# Theatre j's Optimization Problem

- Theatre 'j' of course wants to maximize his total market share.
- Let  $X_{jk}$  is the marketing allocation by Theatre 'j' against theatre 'k'
- $$\max_{\{X_{jk}\}_{k \in N(j)}} \sum_{k \in N(j)} \frac{X_{jk}}{X_{jk} + X_{kj}} \cdot W_{jk}$$
$$\text{s.t. } \sum_{k \in N(j)} X_{jk} = \bar{X}_j$$
- The above optimization problem is solved simultaneously by all  $j \in V$
- Solving the optimization problem will yield the optimal marketing allocations in all markets  $\{X_{jk}^*\}_{k \in N(j)} \forall j \in V$



# Market Shares

- The market share of theatre 'j' ,  $\pi_j^* = \sum_{k \in N(j)} \left[ \frac{X_{jk}^*}{X_{jk}^* + X_{kj}^*} \right] \cdot W_{jk}$
- The resulting  $HHI^* = \sum_{j \in V} [\pi_j^*]^2$
- Clearly  $HHI^*$  is a function of the marketing budget vector  $(\bar{X}_i)_{i \in V}$

# The Policy Maker's Problem

- How to allocate (or re-allocate with taxes / subsidies) the marketing budgets.
- Objective: Minimize HHI