

# CS 524: Introduction to Optimization

## Lecture 8 : Minimax problems

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# A New Case: Demand Uncertainty

- Let's suppose now that we don't know demand with certainty.
- We have a set  $S$  of scenarios for the demand:  $d_{ts}$  demand for shoes in period  $t$  under scenario  $s$
- We must decide on production and hiring decision now
- Inventory and backlogging is allowed to vary with scenario
- Can we give a model that will **minimize the maximum cost** we pay under any scenario

# Cost Structure

$$c_1 = \sum_{t \in T} (\delta x_t + \alpha w_t + \beta o_t + \eta h_t + \zeta f_t + \iota L_{t1} + \theta S_{t1})$$

$$c_2 = \sum_{t \in T} (\delta x_t + \alpha w_t + \beta o_t + \eta h_t + \zeta f_t + \iota L_{t2} + \theta S_{t2})$$

$$c_3 = \sum_{t \in T} (\delta x_t + \alpha w_t + \beta o_t + \eta h_t + \zeta f_t + \iota L_{t3} + \theta S_{t3})$$

$$\min \max\{c_1, c_2, c_3\}$$

# Minimax

- **Minimax**: Minimize the maximum of a collection of linear functions.

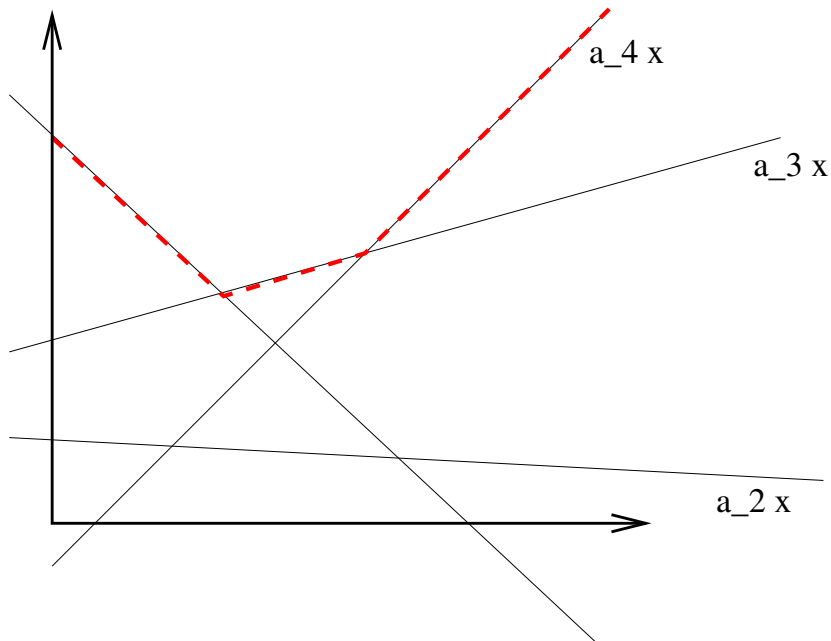
$$\min_{x \in X} f(x) \stackrel{\text{def}}{=} \left( \max_i \sum_{j \in N} a_{ij} x_j \right)$$

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## It's All About The Shape

- If  $f(x)$  is convex, then minimizing  $f(x)$  is easy, and we can look for a “trick” to model this as a linear program
- (Maximizing Concave functions is also easy)

# Minimax

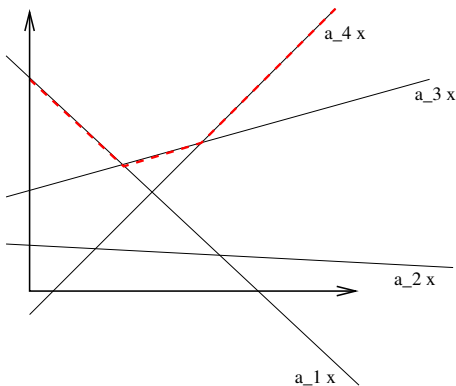


# Minimax/Maximin

## Key Point

- You *CANNOT* just maximize each of the individual functions and then just take the minimum!

$$\min f(x) = \max\{3 - 2x, 2x, 1 + x\}, \text{ subject to } 0 \leq x \leq 3$$



$f_i(x)$	max	arg max
$3 - 2x$	3	0
$2x$	6	3
$1 + x$	4	3

**True Min:**  $x^* = 2/3, f(x) = 5/3$

# Modeling Minimax

## Key Equivalences!

$$z \leq \min_{i \in M} a_i^T x \Leftrightarrow z \leq a_i^T x \quad \forall i \in M$$

$$z \geq \max_{i \in M} a_i^T x \Leftrightarrow z \geq a_i^T x \quad \forall i \in M$$

- $\min_{x \in X} f(x) \stackrel{\text{def}}{=} \max_{i \in M} a_i^T x$
- **Step 1:**  $\min_{x \in X, z} z \text{ s.t. } z \geq f(x)$
- **Step 2:**  $\min_{x \in X, z} z \text{ s.t. } z \geq \sum_{j \in N} a_{ij} x_j \quad \forall i \in M$
- **Special case:**  $\min_{x \in X} f(x) = |x|$ ;  $\min_{x \in X, z} z \text{ s.t. } z \geq x, z \geq -x$

# Trick: Modeling Absolute Value – Constraint

## Modeling $|\cdot|$ in Constraints

We would like to model  $|a^T x| \leq b$

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## The Trick

- Note that  $|a^T x| = \max\{a^T x, -a^T x\}$
- Replace  $|a^T x| \leq b$  with two inequalities

$$a^T x \leq b \quad \text{and} \quad -a^T x \leq b$$

- Works for any finite maximum of linear functions (see later)



# Maximin

- Maximin :  $\max_{x \in X} f(x) \stackrel{\text{def}}{=} \min_i \sum_{j \in N} a_{ij} x_j$
- The **minimum** of linear functions is a concave function, and maximizing such functions is easy: There is a similar LP “trick” we can do:

$$\max_{x \in X, z} z, \quad z \leq \sum_{j \in N} a_{ij} x_j \quad \forall i$$

## ShoeCo Minimax: see shoeco3.gms

$$\min z \quad \text{s.t.}$$

$$z \geq \sum_{t \in T} (\delta x_t + \alpha w_t + \beta o_t + \eta h_t + \zeta f_t + \iota L_{ts} + \theta S_{ts}), \quad \forall s \in S$$

$$ax_t \leq Hw_t + o_t \quad \forall t \in T$$

$$o_t \leq Ow_t \quad \forall t \in T$$

$$l_{ts} = l_{t-1,s} + x_t - d_{ts} \quad \forall t \in T, \forall s \in S$$

$$l_{ts} = L_{ts} - S_{ts} \quad \forall t \in T, \forall s \in S, \quad l_{0,s} = \mathcal{I}_0$$

$$w_t = w_{t-1} + h_t - f_t \quad \forall t \in T, \quad w_0 = \mathcal{W}_0$$

$$x_t, w_t, h_t, f_t, \geq 0 \quad \forall t \in T$$

$$S_{ts}, L_{ts} \geq 0 \quad \forall t \in T, s \in S$$

# Save and restart

- GAMS allows the state of a model to be saved to a file for later use:  
`gams shoeco s=shoe`
- This “saves” the state of the shoeco model into a file `shoe.g00`.  
Note command line argument “s=shoe” can be put into the box that is to the right of the “run” button in studio
- You can then “restart” with new command (just as if you had typed them in at the end of `shoeco.gms`) using a new file `shoeco3.gms`:  
`gams shoeco3 r=shoe`
- Note also the files `shoerun.gms` (that runs all three models) and `shoecoI.gms` (that incorporates initial conditions in a different way)

# GAMS – Pretty Display

- “The Display Statement” in GUG.
- `option decimals = 1;`
- `option ident:d-value:r-value:c-value ;`
  - ▶ Displays `ident` with d-value decimals, putting r-value rows together and c-value columns together
- Putting `r-value = 0`, produces a list format for display
- See file `display.gms`