# Lesson 29. Maximin and Minimax Objectives

# 1 The minimum of a collection of functions

**Example 1.** Santa Claus is trying to decide how to give candy canes to three children: Ann, Bob, and Carol. Because Santa is a very busy person, he has decided to give the same number of candy canes to each child. Let *x* be the number of candy canes each child receives. Also, because Santa knows everything, he knows the happiness level of each child as a function of the number of candy canes he or she receives:

Ann: 1 + 2x Bob: 2 + x Carol:  $5 - \frac{1}{2}x$ 

Due to the struggling economy, Santa's budget limits him to give each child at most 6 candy canes. To be fair to all 3 children, he has decided that he wants to **maximize the minimum happiness level of all 3 children**. In other words, he is trying to maximize the worst-case happiness level.

Let f(x) be the minimum happiness level of all 3 children when each child receives x candy canes:

What is f(0)? f(1)? f(2)?

Graph f(x):



Santa's optimization problem is:

By looking at the graph of f(x), give an optimal solution to Santa's optimization problem. What are Ann's, Bob's, and Carol's happiness levels at this solution?

**Observation.** The minimum of a collection of numbers is the largest value that is less than or equal to each number in the collection.

For example, consider  $\min\{3, 8, -2, 6, 9\}$ .

Using this observation, we can rewrite Santa's optimization problem as:

This looks familiar...

What if we maximized the sum of the happiness factors of all 3 children? What is the optimal solution? What is Ann's, Bob's, and Carol's happiness levels at this solution?

→ Maximizing the minimum results in more uniform performance than maximizing the sum

### 2 Maximin objective functions

- Define:
  - decision variables  $x_j$  for  $j \in \{1, ..., n\}$
  - constants  $a_{ij}$  for  $i \in \{1, \ldots, m\}$  and  $j \in \{1, \ldots, n\}$
  - constants  $b_i$  for  $i \in \{1, \ldots, m\}$
- Consider a maximin objective function:

maximize 
$$\min\left\{\sum_{j=1}^{n} a_{1j}x_j + b_1, \sum_{j=1}^{n} a_{2j}x_j + b_2, \dots, \sum_{j=1}^{n} a_{mj}x_j + b_m\right\}$$

- We can convert a maximin objective function into a linear objective function and linear constraints:
  - $\circ~$  Add auxiliary decision variable z
  - Change objective:

• Add constraints:

$$z \leq \sum_{j=1}^{n} a_{ij} x_j + b_i$$
 for  $i \in \{1, \ldots, m\}$ 

• Main idea: the minimum of a collection of numbers is the largest value that is less than or equal to each number in the collection.

#### 3 Minimax objective functions

• We can similarly convert a minimax objective function

minimize 
$$\max\left\{\sum_{j=1}^{n} a_{1j}x_j + b_1, \sum_{j=1}^{n} a_{2j}x_j + b_2, \dots, \sum_{j=1}^{n} a_{mj}x_j + b_m\right\}$$

into a linear objective function and constraints:

- $\circ$  Add auxiliary decision variable z
- Change objective:

minimize z

• Add constraints:

$$z \ge \sum_{j=1}^n a_{ij} x_j + b_i \qquad \text{for } i \in \{1, \dots, m\}$$

• Similar idea: the maximum of a collection of numbers is the smallest value that is greater than or equal to each number in the collection.

**Example 2.** The State of Simplex wants to divide the effort of its on-duty officers among 8 highway segments to reduce speeding incidents. You, the analyst, were able to estimate that for each highway segment  $j \in \{1, ..., 8\}$ , the weekly reduction in speeding incidents is  $r_j + s_j x_j$ , where  $x_j$  is the number of officers assigned to segment j. Due to local ordinances, there is an upper bound  $u_j$  on the number of officers assigned to highway segment j per week, for  $j \in \{1, ..., 8\}$ . There are 25 officers per week to allocate.

The State of Simplex has decided that it wants to maximize the worst-case reduction in speeding incidents among all highway segments. Write a linear program that allocates officers to highway segments according to this objective.

# Input parameters.

 $H = \text{set of highway segments} = \{1, \dots, 8\}$ 

- $r_j, s_j$  = coefficients on weekly incident reduction function for highway segment *j* for  $j \in H$ 
  - $u_j$  = upper bound on number of officers assigned to highway segment *j* per week for  $j \in H$
  - N = number of officers per week to allocate = 25