# Linear Programming CSCI 432

# Linear Program (LP)



• Must be linear combinations of variables.

### **Optimal Value**

 $x_2$ 40 30 20 10  $x_1$ 40 30 10 20 0

Objective: 
$$\max f(x_1, x_2)$$
  
Subject to:  $c_1(x_1, x_2)$   
 $c_2(x_1, x_2)$   
 $\vdots$   
 $c_n(x_1, x_2)$ 

Properties of optimal solutions:

- 1. Optimal value occurs at a vertex.
- 2. Local optimum is global optimum.

Algorithm to find optimal solution: Test each vertex in order until no neighbors have larger (or smaller) value.

| Issue          | Urban | Suburban | Rural |
|----------------|-------|----------|-------|
| Infrastructure | -2    | +5       | +3    |
| Gun Control    | +8    | +2       | -5    |
| Farm Subsidies | +0    | +0       | +10   |
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#### Step 1: Make variables.

"What are the decisions that need to be made?"

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- $x_1 = \$$  spent on infrastructure.
- $x_2 =$ \$ spent on gun control.

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\$ spent on farm subsidies.

$$x_4 =$$
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#### Step 2: Make objective.

"What are we trying to maximize or minimize?"

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Subjective:  $\min x_1 + x_2 + x_3 + x_4$ Subject to:  $-2x_1 + 8x_2 + 10x_4 \ge 50,000$ 

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#### **Optimal solution?**

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#### **Optimal solution?**

https://docs.scipy.org/doc/scipy/reference/ generated/scipy.optimize.linprog.html



Objective: 
$$\min x_1 + x_2 + x_3 + x_4$$
  
Subject to:  $-2x_1 + 8x_2 + 10x_4 \ge 50,000$   
 $5x_1 + 2x_2 \ge 100,000$   
 $3x_1 - 5x_2 + 10x_3 - 2x_4 \ge 25,000$   
 $x_1, x_2, x_3, x_4 \ge 0$   
 $x_1 + x_2 + x_3 + x_4 = [1, 1, 1, 1] \begin{bmatrix} x_1 \\ x_2 \\ x_3 \\ x_4 \end{bmatrix}$ 

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 $x_1, x_2, x_3, x_4 \ge 0$   
 $\lim_{x} c^T x$   
such that  $A_{ub}x \le b_{ub}$ ,  
 $A_{eq}x = b_{eq}$ ,  
 $l \le x \le u$ ,

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Subject to:  $\begin{bmatrix} -2 & 8 & 0 & 10 \\ 5 & 2 & 0 & 0 \\ 3 & -5 & 10 & -2 \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \\ x_3 \\ x_4 \end{bmatrix} \ge \begin{bmatrix} 50,000 \\ 100,000 \\ 25,000 \end{bmatrix}$   
 $\begin{bmatrix} x_1 \\ x_2 \\ x_3 \\ x_4 \end{bmatrix} \ge \begin{bmatrix} 0 \\ 0 \\ 0 \\ 0 \\ 0 \end{bmatrix}$ 

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 $\begin{bmatrix} x_1 \\ x_2 \\ x_3 \\ x_4 \end{bmatrix} \ge \begin{bmatrix} 0 \\ 0 \\ 0 \\ 0 \\ 0 \end{bmatrix}$ 







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 $3x_1 - 5x_2 + 10x_3 - 2x_4 \ge 25,000$   
 $x_1, x_2, x_3, x_4 \ge 0$   
Objective:  $\min[1,1,1,1] \begin{bmatrix} x_1 \\ x_2 \\ x_3 \\ x_4 \end{bmatrix}$   
Subject to:  $\begin{bmatrix} 2 & -8 & 0 & -10 \\ -5 & -2 & 0 & 0 \\ -3 & 5 & -10 & 2 \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \\ x_3 \\ x_4 \end{bmatrix} < \begin{bmatrix} -50,000 \\ -100,000 \\ -25,000 \end{bmatrix}$   
 $= 2x_1 + 8x_2 + 10x_4 \ge 50,000$   
 $= 2x_1 - 8x_2 - 10x_4 \le -50,000$   
 $= 2x_1 - 8x_2 - 10x_4 \le -50,000$   
 $f(x) \ge a$  if and only if  $-f(x) \le -a$ 

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 $\begin{bmatrix} x_1 \\ x_2 \\ x_3 \\ x_4 \end{bmatrix} \ge \begin{bmatrix} 0 \\ 0 \\ 0 \\ 0 \end{bmatrix}$  Code...

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Do we need non-negativity constraints?







Objective:  $\max 100x_1 + 300x_2$ Subject to:  $x_1 \le 30$  $x_2 \le 20$  $x_1 + x_2 \le 40$  $x_1, x_2 \ge 0$ 

Objective: $\min x$ Subject to: $x \ge 0$ 

**Optimal Value: ?** 

Objective: $\min x$ Subject to: $x \ge 0$ 

Optimal Value: x = 0



#### **Optimal Value: ?**



#### Optimal Value: $x = -\infty$

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Do we need non-negativity constraints? Check and see!

A district has an urban area (100,000 voters), suburban area (200,000 voters), and rural area (50,000 voters). A politician decided she needs at least half of the voters in each area to support her. Her campaign has four issues which are popular/unpopular with specific areas. The campaign has ever of the number of voters gained or lost based on each \$1 spent adverted to the number campaign aims to minimize advertising expension in the number implicitly them in the number implicitly them in the number

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| Gun Control              | +8    | 12       | e pr                      | ent on gun control.                           |
| Farm Subsidies           | +0    | . 19 21  |                           | s = \$ spent on farm subsidies.               |
| Gasoline Tax             | ss    | n. at    | NIC                       | $x_4 = $ \$ spent on gasoline tax.            |
|                          | Lese, | nega     |                           | Objective: $\min x_1 + x_2 + x_3 + x_4$       |
|                          | nor   |          |                           | Subject to: $-2x_1 + 8x_2 + 10x_4 \ge 50,000$ |
| Do we new non-negativity |       | tivity   | $5x_1 + 2x_2 \ge 100,000$ |   |
| constraints?             |       |          |                           | $3x_1 - 5x_2 + 10x_3 - 2x_4 \ge 25,000$       |
|                          |       |          |                           | $x_1, x_2, x_3, x_4 \ge 0$                    |