

# Licenciatura em Gestão

## Operational Research Chapter 2

2017-2018



100 ANOS A PENSAR NO FUTURO



# LP – The Simplex Method

## 2. Simplex Method

### 2.1 Introduction

### 2.2 Augmented Form and Basic Feasible Solutions

### 2.3 Simplex Algorithm



## Prototype Example 1

$x_1$  – no. batches of P1 produced per week (P1=8-foot glass door with aluminum framing)

$x_2$  – no. batches of P2 produced per week (P2=4×6 foot double-hung wood framed window)

$Z$  – total profit per week (in thousands of dollars) from producing these two products

**Linear Programming (LP) Model:**

$$\text{Max } Z = 3x_1 + 5x_2$$

$$\text{s. t. } \begin{cases} x_1 & \leq 4 \\ & 2x_2 \leq 12 \\ 3x_1 + 2x_2 & \leq 18 \\ x_1, x_2 & \geq 0 \end{cases}$$



# Linear Programming

## Definitions I (Recall)

**Solution** of an LP – a vector of  $R^n$  whose components are the values of the variables;

**Feasible Solution (FS)** – a solution that satisfies all the constraints (functional and sign);

**Non Feasible Solution (NFS)** – a solution that does not satisfy at least one of the constraints;

**Feasible Region (FR)** – the set of all feasible solutions;

**Optimal Solution (OS)** – a feasible solution that gives the best value to the objective function (OF)  
(the best value=maximum or minimum);

**Optimal value** – the value of the objective function at an optimal solution;

**Binding constraint** in a solution – a constraint that holds with equality at that solution;

**To solve an LP** is to determine the optimal solution (or solutions) and the optimal value or to conclude that an optimal solution does not exist and why.



# Linear Programming

## Properties (Recall)

**Prop 1:** The Feasible Region of an LP problem is either an empty set or a convex set.

**Prop 2:** If the Feasible Region of an LP problem **is nonempty and bounded** then at least **an optimal solution exists**.

**Prop 3:** If an LP problem has optimum then **at least one of its corner point feasible** solutions (CPF) **is an optimal solution**.

**Prop 4:** Given an LP Problem with optimum, if a CPF has no adjacent CPF with a better value for the Objective Function then that point is an optimal solution.



# LP – The Simplex Method

**Prop 3:** If an LP problem has optimum then at least one of its corner point feasible solutions (FCP) is an optimal solution. **(Recall)**

5 constraints 2 binding



maximum  $C_2^5 = \frac{5!}{2!(5-2)!}$  solutions !

$$\begin{array}{l} (3) \left\{ \begin{array}{l} x_1 = 4 \\ 2x_2 = 12 \end{array} \right. \quad \left\{ \begin{array}{l} x_1 = 4 \\ x_2 = 6 \end{array} \right. \\ (4) \left\{ \begin{array}{l} x_1 = 4 \\ 2x_2 = 12 \end{array} \right. \quad \left\{ \begin{array}{l} x_1 = 4 \\ x_2 = 6 \end{array} \right. \end{array}$$

$$\begin{array}{l} \text{Max } z = 3x_1 + 5x_2 \\ \left\{ \begin{array}{l} x_1 \leq 4 \quad (3) \\ 2x_2 \leq 12 \quad (4) \\ 3x_1 + 2x_2 \leq 18 \quad (5) \\ x_1 \geq 0 \quad (1) \\ x_2 \geq 0 \quad (2) \end{array} \right. \end{array}$$

Feasible ?

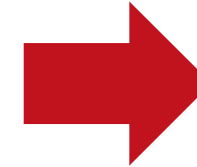
$$\left\{ \begin{array}{l} 3x_1 + 2x_2 \leq 18 \quad (5) \text{ False} \\ x_1 \geq 0 \quad (1) \text{ OK} \\ x_2 \geq 0 \quad (2) \text{ OK} \end{array} \right. \quad \text{NO!}$$

### Binding constraints

$x_1 \geq 0$	$x_2 \geq 0$	$x_1 \leq 4$	$2x_2 \leq 12$	$3x_1 + 2x_2 \leq 18$
Yes	Yes			
Yes		Yes		
Yes			Yes	
Yes				Yes
	Yes	Yes		
	Yes		Yes	
	Yes			Yes
		Yes	Yes	
		Yes		Yes
			Yes	Yes

### solution

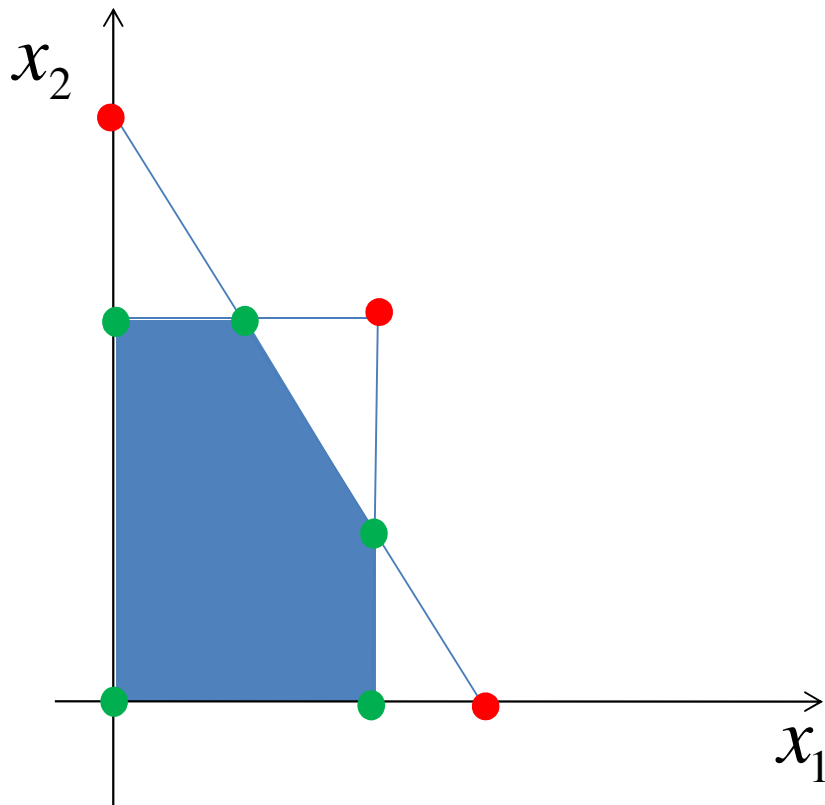
Feasible / infeasible



$x_1$	$x_2$	
0	0	0
No sol.		
0	6	30
0	9	
4	0	12
No sol.		
6	0	0
4	6	
4	3	27
2	6	36

Evaluate the objective function value of the feasible solutions

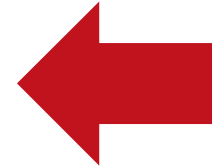
Choose the best!



solution

Feasible / infeasible

$x_1$	$x_2$	
0	0	Feasible
No sol.		
0	6	Feasible
0	9	Infeasible
4	0	Feasible
No sol.		
6	0	Infeasible
4	6	Infeasible
4	3	Feasible
2	6	Feasible

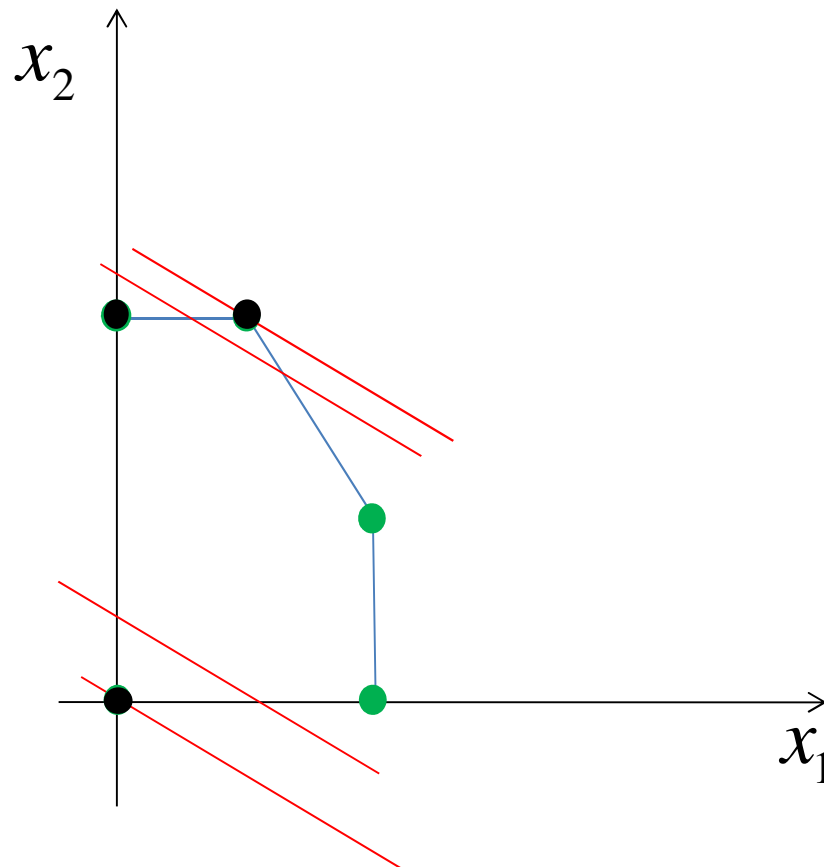






# LP – The Simplex Method

**Prop 4:** Given an LP Problem with optimum, if a FCP has no adjacent FCP with a better value for the OF then that point is an optimal solution. ( Recall)





# LP – The Simplex Method

In this course

Simplex method to solve LP problems in the **standard form** and **nonnegative right-hand-sides**.

## Definitions

**Standard form** of an LP – a maximization problem

- + all functional constraints expressed by inequalities of the form  $\leq$
- + all variables nonnegative ( $\geq 0$ );

**Augmented form** of an LP – LP model where

- + all variables nonnegative ( $\geq 0$ )
- + all functional constraints expressed by **equations** (using nonnegative variables - **slack variables** or surplus variables);

**Augmented solution** is a solution to the LP problem in the augmented form.

## Properties

**Prop 5:** Every LP problem can be rewritten as an equivalent problem in the maximisation augmented form.



# LP – The Simplex Method

## Writing an LP problem as a maximization augmented form problem

**Objective:**  $\text{Min } Z = \sum_{j=1}^n c_j x_j \Leftrightarrow \text{Max}(-Z) = \sum_{j=1}^n (-c_j) x_j$  (Min  $Z = -\text{Max}(-Z)$ )

**Constraints:**

$$\text{"}\leq\text{"}: \sum_{j=1}^n a_{ij} x_j \leq b_i \Leftrightarrow \sum_{j=1}^n a_{ij} x_j + x_{n+i} = b_i \wedge x_{n+i} \geq 0$$

$$\text{"}\geq\text{"}: \sum_{j=1}^n a_{ij} x_j \geq b_i \Leftrightarrow \sum_{j=1}^n a_{ij} x_j - x_{n+i} = b_i \wedge x_{n+i} \geq 0$$

**Variables:**

$$x_j \leq 0 \Leftrightarrow x_j = -x'_j \quad (x'_j \geq 0)$$

$$x_j \text{ livre} \Leftrightarrow x_j = x'_j - x''_j \quad \left( \begin{array}{l} x'_j = \text{Max}\{0; x_j\} \geq 0 \\ x''_j = \text{Max}\{0; -x_j\} \geq 0 \end{array} \right)$$



# LP – The Simplex Method

## Definitions

Consider a problem with  $m$  equations and  $\ell$  ( $>m$ ) nonnegative variables.

Set to zero  $\ell - m$  **nonbasic variables (NBV)**. If possible, in a unique way, solve the system of linear equations to obtain the value of the remaining  $m$  variables – **basic variables (BV)**

 **Basic Solution (BS)**.

**Basic Feasible Solution (BFS)** – is a BS with all variables verifying the signal constraints.

Otherwise the solution is **Basic InFeasible Solution (BIFS)**.

1 BFS  1 corner point of the FR (Feasible Region)

1 corner point of the FR  at least one BFS

**Adjacent basic solutions** - only one different BV (In  $\mathbb{R}^2$  - extreme points of a line segment)



# LP – The Simplex Method

Prototype augmented form

$$\text{Max } z = 3x_1 + 5x_2$$

$$s.t. \begin{cases} x_1 & & & \leq & 4 \\ & & 2x_2 & \leq & 12 \\ 3x_1 & + & 2x_2 & \leq & 18 \\ x_1, & x_2 & & \geq & 0 \end{cases}$$

$$\text{Max } z = 3x_1 + 5x_2$$

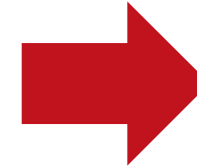
$$s.t. \begin{cases} x_1 & & + & x_3 & & = & 4 \\ & & 2x_2 & & + & x_4 & = & 12 \\ 3x_1 & + & 2x_2 & & & + & x_5 & = & 18 \\ x_1, & x_2, & x_3, & x_4, & x_5 & \geq & 0 \end{cases}$$

### Binding constraints

$x_1$	$x_2$	$x_3$	$x_4$	$x_5$
0	0	4	12	18
0	-	0	-	-
0	6	4	0	6
0	9	4	-6	0
4	0	0	12	6
-	0	-	0	-
6	0	-2	12	0
4	6	0	0	-6
4	3	0	6	0
2	6	2	0	0

### solution

Feasible / infeasible



$x_1$	$x_2$	
0	0	Feasible
No sol.		
0	6	Feasible
0	9	Infeasible
4	0	Feasible
No sol.		
6	0	Infeasible
4	6	Infeasible
4	3	Feasible
2	6	Feasible



# LP –simplex algorithm

$$\text{Max } z = 3x_1 + 5x_2 = 0$$

$$s.t. \begin{cases} x_1 + x_3 = 4 & x_2 \leq \infty \\ 2x_2 + x_4 = 12 & x_2 \leq 6 \left(\frac{12}{2}\right) \\ 3x_1 + 2x_2 + x_5 = 18 & x_2 \leq 9 \left(\frac{18}{2}\right) \\ x_1, x_2, x_3, x_4, x_5 \geq 0 \end{cases}$$

	Bas		coefficients							
iter	Var	Eq	Z	$x_1$	$x_2$	$x_3$	$x_4$	$x_5$	RHS	Op?
0	Z	0	1	-3	-5	0	0	0	0	NO
	$x_3$	1	0	1	0	1	0	0	4	
	$x_4$	2	0	0	2	0	1	0	12	
	$x_5$	3	0	3	2	0	0	1	18	

$x_2$  basic



$$\text{Min} \left\{ \frac{12}{2}, \frac{18}{2} \right\}$$

$x_4$  non basic



# LP –simplex algorithm (George Dantzig, 1947)

0. Consider an LP problem in the *standard* form with all RHS nonnegative.

## Initialization

1. Write the problem in the *augmented* form
2. Determine an initial BFS: NBV = decision variables and solve the system;  
Write the **simplex tableau**;  $k \leftarrow 1$

## Iteration $k$

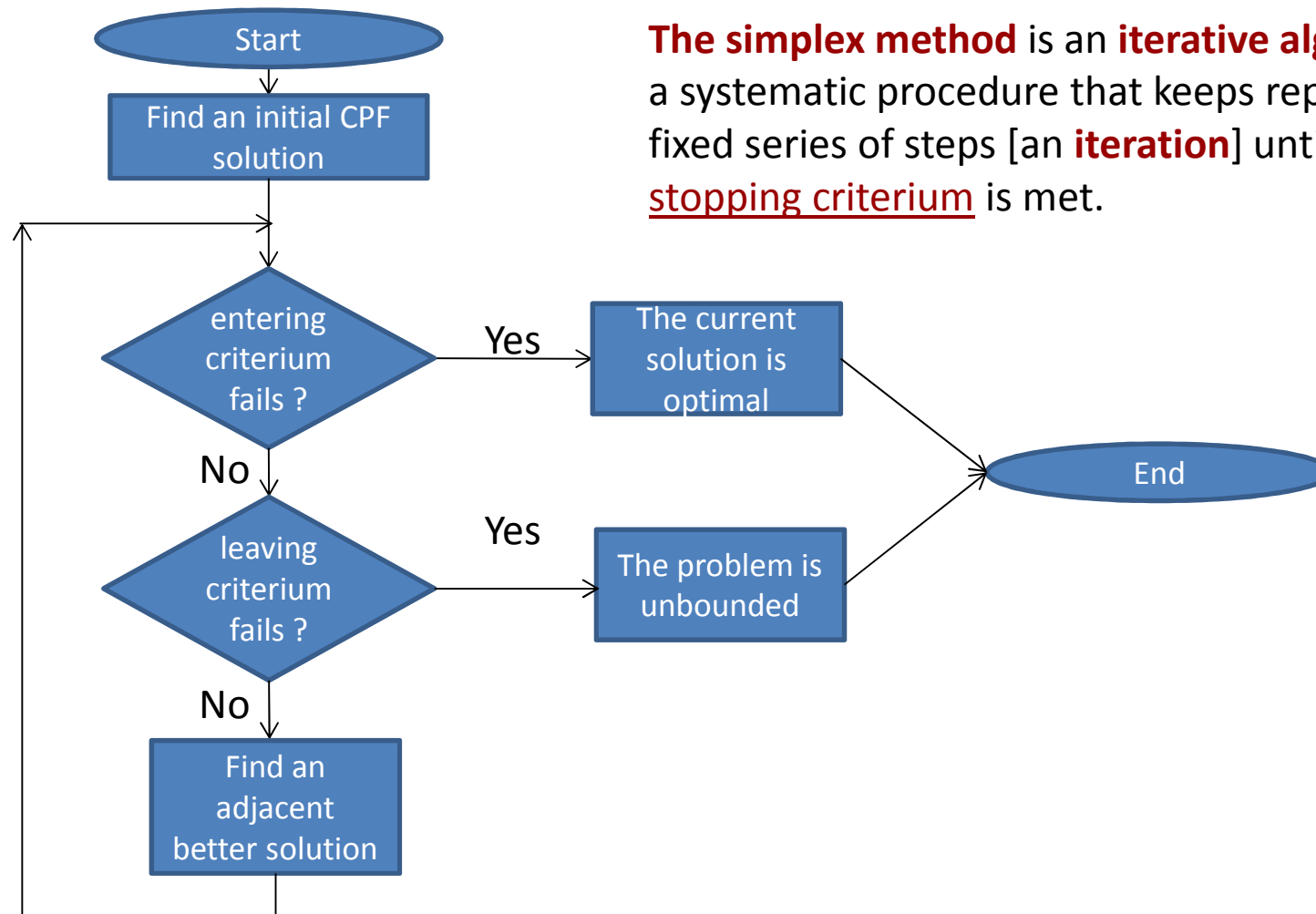
3. **If** the values in the Objective Function row  $\geq 0$ , **STOP** (optimal basic solution found).  
**Otherwise, EC:**  $\text{Min}\{\text{coeffic.} < 0 \text{ in the Objective Function row}\}$  [for the new BV  $x_p$ ]
4. **If** all the coeffic. in the column of the  $x_p$  variable are  $\leq 0$ , **STOP** (unbounded Obj. Function).  
**Otherwise, LC:**  $\text{Min}\left\{\frac{\text{RHS}}{\text{coeffic.} > 0 \text{ in the column of } x_p}\right\}$  [for the new NBV  $x_r$ ]
5. Update the simplex tableau  $\Rightarrow$  new BFS:  $x_p$  BV;  $x_r$  NBV;  
 $k \leftarrow k + 1$ ; go to 3.

EC=entering criterium;LC=Leaving criterium.





# LP – The Simplex Method



**The simplex method** is an **iterative algorithm** - a systematic procedure that keeps repeating a fixed series of steps [an **iteration**] until a stopping criterium is met.