



# INTRO TO LINEAR PROGRAMMING (LP)

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# Intro to LP

# To express a problem in terms of mathematical programming you need:

1. An objective (what to optimize)
2. Alternative actions
3. Limited resources
4. Variables need to be related
5. It needs to be possible to express 1, 2, and 3 in mathematical language through equations or inequalities

# Example:

A production plant manufactures two types of water heaters (type 1 & 2). Find the production schedule (number of units type 1 and 2 to be manufactured) that **maximizes** profits.

- profits for selling type 1 = \$800, per unit
- profits for selling type 2 = \$600, per unit
- Both types need to be processed in two different machines in any order
  - Type 1 requires:
    - 4 hours of processing in machine A
    - 2 hours in machine B
  - Type 2 requires:
    - 2 hours in machine A
    - 4 hours in machine B
  - There is a limited number of processing hours available at each machine
    - 60 hours for machine A
    - 48 hours for machine B

Can this be formulated as a mathematical program?

# What do we want to optimize?



- We want to maximize profits!!

# What are the limited resources?



- The time of machines A and B

# What do we need to decide?

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- How many units of water heater type I and type II

# Solution



- Graphically
- Algebraically
- Computer software



# Graphical method

1. **Formulate problem**
  2. Construct a graph and plot constraint lines
  3. Determine feasible region
  4. Find optimal solution
    - ▣ Calculate value of objective function for all corners and choose optimal
- Or
- ▣ Plot two objective function lines to determine direction of improvement. Choose corner and calculate value of objective function

# Step 1: Formulating the problem

1. Identify **decision variables** and **objective function**.

Name your variables

$z$ : profits

$x_1$ : number of units of water heater type 1 to produce

$x_2$  : number of units of water heater type 2 to produce

2. Write equation for **objective function**

$$\max_{x_1, x_2} z = \$800 x_1 + \$600 x_2$$

# Very important

- We will formulate this optimization problem as one of **linear programming (LP)**
- This means that
  - ▣ Our decision variables will be represent by **linear relationships**
  - ▣ And we assume that the decision variables can be **any positive real number**

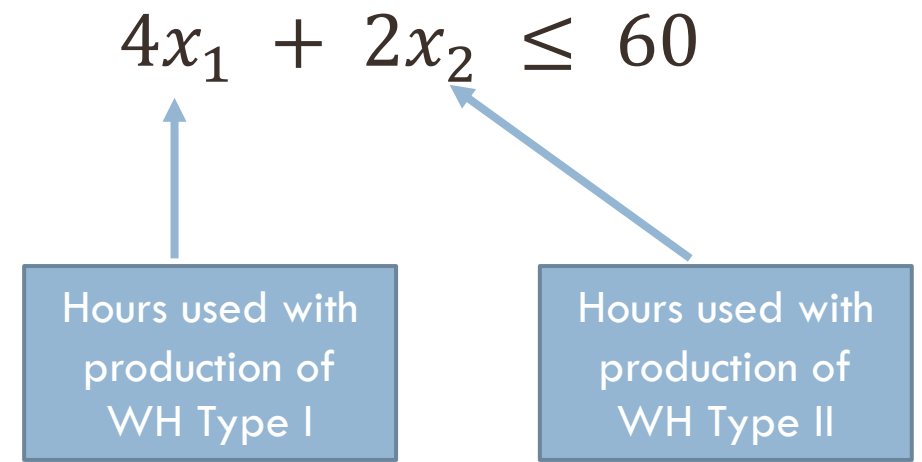
# Formulating the problem

1. Identify **decision variables** and **objective function**. Name your variables
2. Write equation for **objective function**
3. Identify **constraints**
  - ▣ Constraint 1: Cannot use more than the available hours at machine A
  - ▣ Constraint 2: Cannot use more than the available hours at machine B
4. Write equations to represent constraints

# Equation stating we cannot use more than the available hours for Machine A

$$4x_1 + 2x_2 \leq 60$$

Hours used with  
production of  
WH Type I



Hours used with  
production of  
WH Type II

# Formulating the problem

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3. Identify **constraints**
  - ▣ Constraint 1: Cannot use more than the available hours at machine A
  - ▣ Constraint 2: Cannot use more than the available hours at machine B
4. Write equations to represent constraints
  - ▣ C1:  $4x_1 + 2x_2 \leq 60$
  - ▣ C2:  $2x_1 + 4x_2 \leq 48$

# Formulating the problem

1. Identify **decision variables** and **objective function**. Name your variables
2. Write equation for **objective function**
3. Identify **constraints**
4. Write equations to represent constraints
5. Write the **non-negativity** constraint

▣ C3:  $x_1, x_2 \geq 0$

# Final LP Formulation

- Maximizing profits in the water heaters' production plant

$$\begin{aligned} \max_{x_1, x_2} \quad & z = \$800 x_1 + \$600 x_2 \\ \text{s. t.} \quad & 4x_1 + 2x_2 \leq 60 \\ & 2x_1 + 4x_2 \leq 48 \\ & x_1, x_2 \geq 0 \end{aligned}$$

- where

*z: profits*

*x<sub>1</sub>: number of units of water heater type 1 to produce*

*x<sub>2</sub>: number of units of water heater type 2 to produce*



# Understanding the Notation

## General Formulation

$$\begin{array}{ll} \max_{x_1, x_2} & z = \$800x_1 + \$600x_2 \\ \text{s. t.} & \begin{array}{l} 4x_1 + 2x_2 \leq 60 \\ 2x_1 + 4x_2 \leq 48 \\ x_1, x_2 \geq 0 \end{array} \end{array}$$

Profit coefficients

Technical coefficients

Right hand side

$$\begin{array}{ll} \max_{x_1, x_2} & z = c_1x_1 + c_2x_2 \\ \text{s. t.} & \begin{array}{l} a_{11}x_1 + a_{12}x_2 \leq b_1 \\ a_{21}x_1 + a_{22}x_2 \leq b_2 \\ x_1, x_2 \geq 0 \end{array} \end{array}$$

□ where

$z$ : profits

$x_1$ : number of units of water heater type 1 to produce

$x_2$ : number of units of water heater type 2 to produce

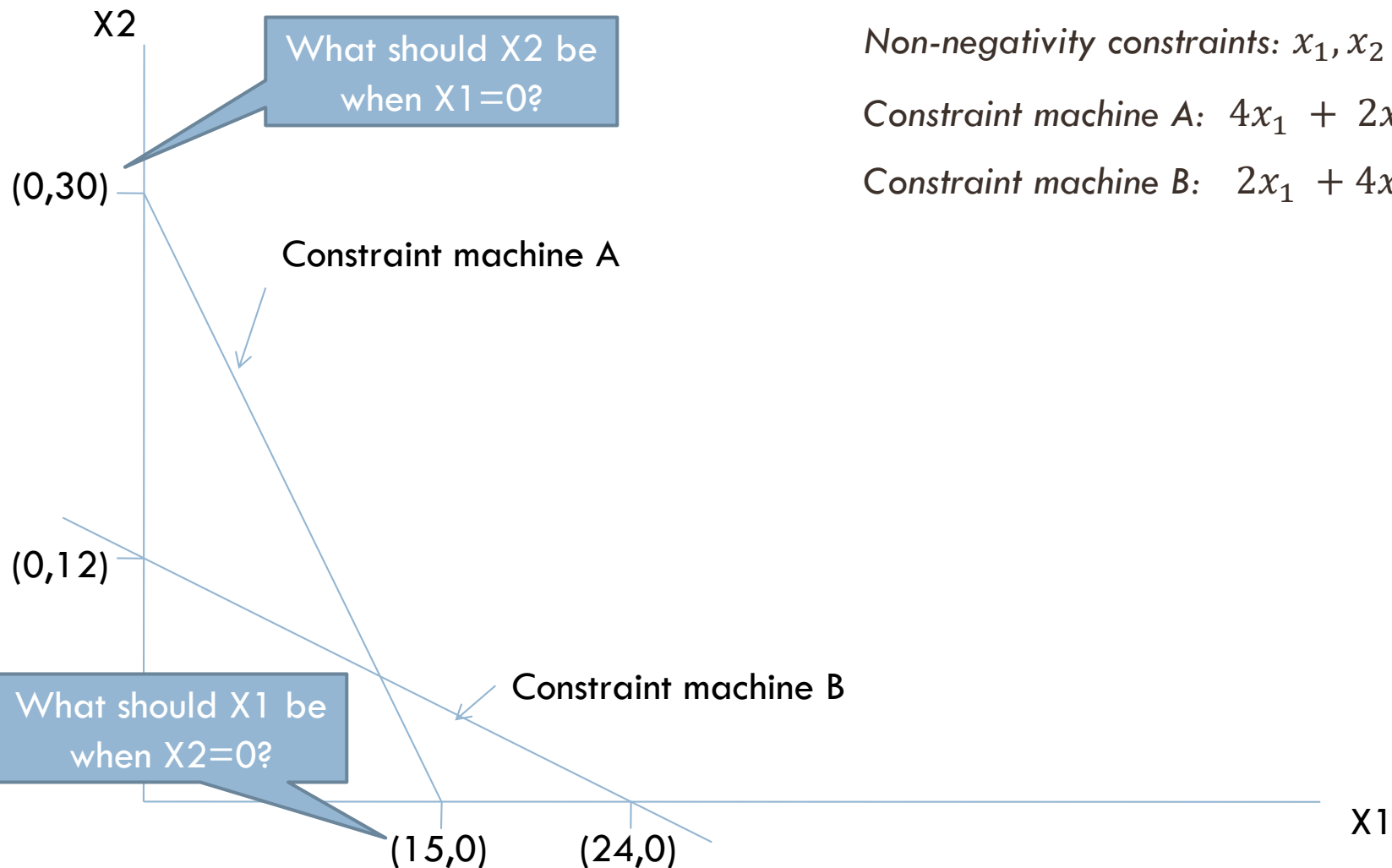
# Graphical method

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- ▣ Plot two objective function lines to determine direction of improvement. Choose corner and calculate value of objective function

# Step 2: Construct a graph and plot constraint lines

- Construct a graph:
  - ▣ Let the x axis represent your first decision variable and the y axis the other decision variable
- Plot constraint lines
  - ▣ Transform constraint equations into equalities
$$4x_1 + 2x_2 = 60$$
$$2x_1 + 4x_2 = 48$$
$$x_1, x_2 = 0$$
  - ▣ Find the intersection points with the x,y axes. For each constraint line ask:
    - What is the value of  $x_1$  when  $x_2$  is 0
    - What is the value of  $x_2$  when  $x_1$  is 0

# Graphically: Plot constraints



Non-negativity constraints:  $x_1, x_2 = 0$

Constraint machine A:  $4x_1 + 2x_2 = 60$

Constraint machine B:  $2x_1 + 4x_2 = 48$

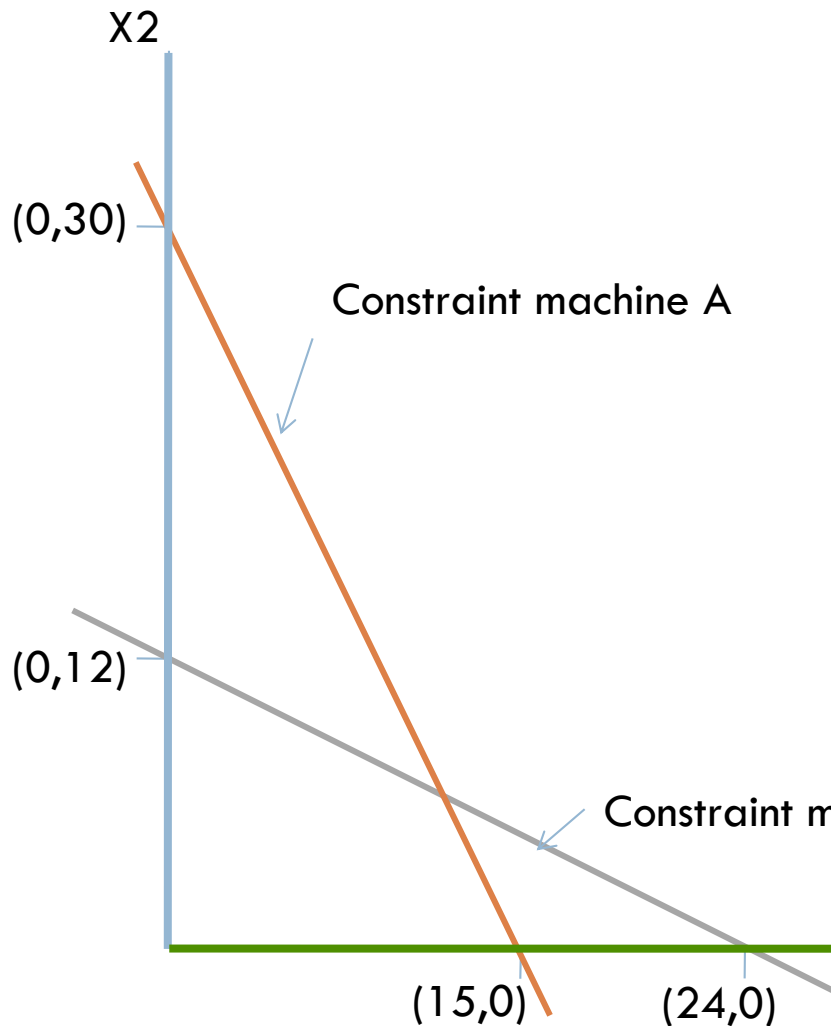
# Graphical method

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# Step 3: Determine Feasible Region

- Determine the feasible (valid) side of each constraint line
- Feasible region is the area of the graph valid for all constraints
- Since the solution needs to meet all constraints → the solution is in the feasible region

# Determine Feasible Region



Plotting constraint lines:

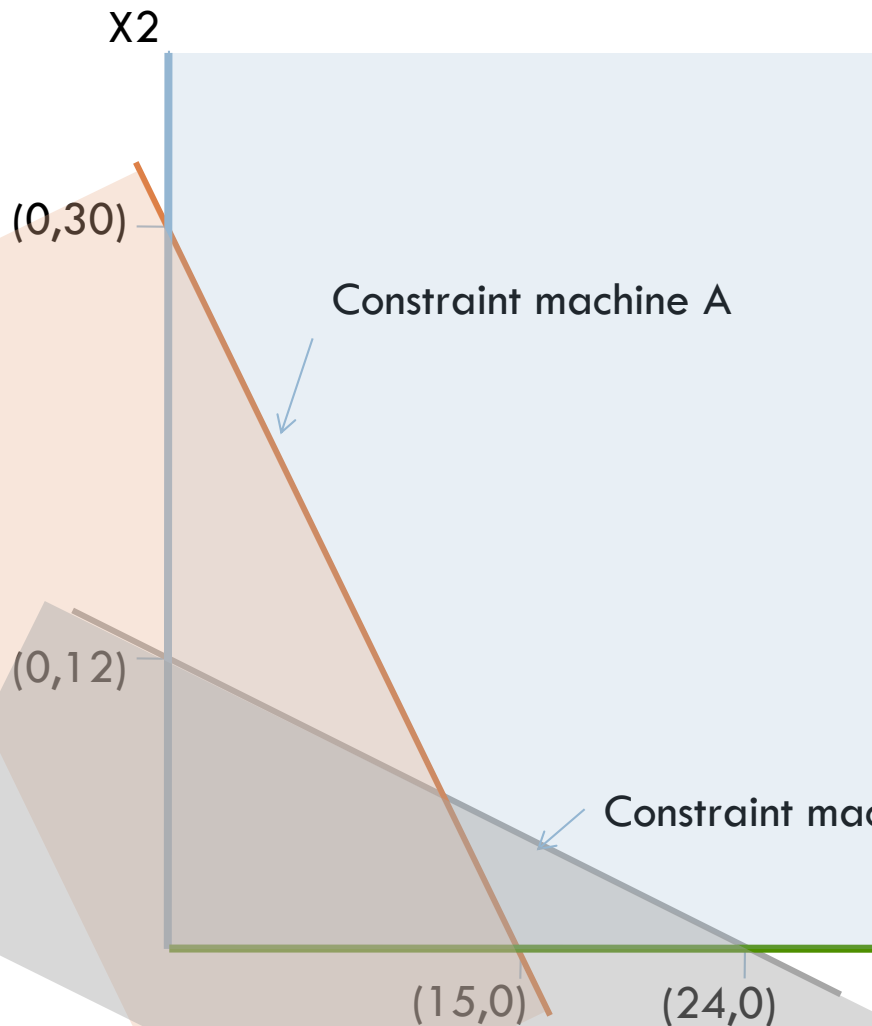
Non-negativity constraints lines:  $x_1 = 0$

$x_2 = 0$

Constraint machine A line:  $4x_1 + 2x_2 = 60$

Constraint machine B line :  $2x_1 + 4x_2 = 48$

# Determine Feasible Region



Find feasible side of each constraint:

Non-negativity constraints lines:  $x_1 = 0$

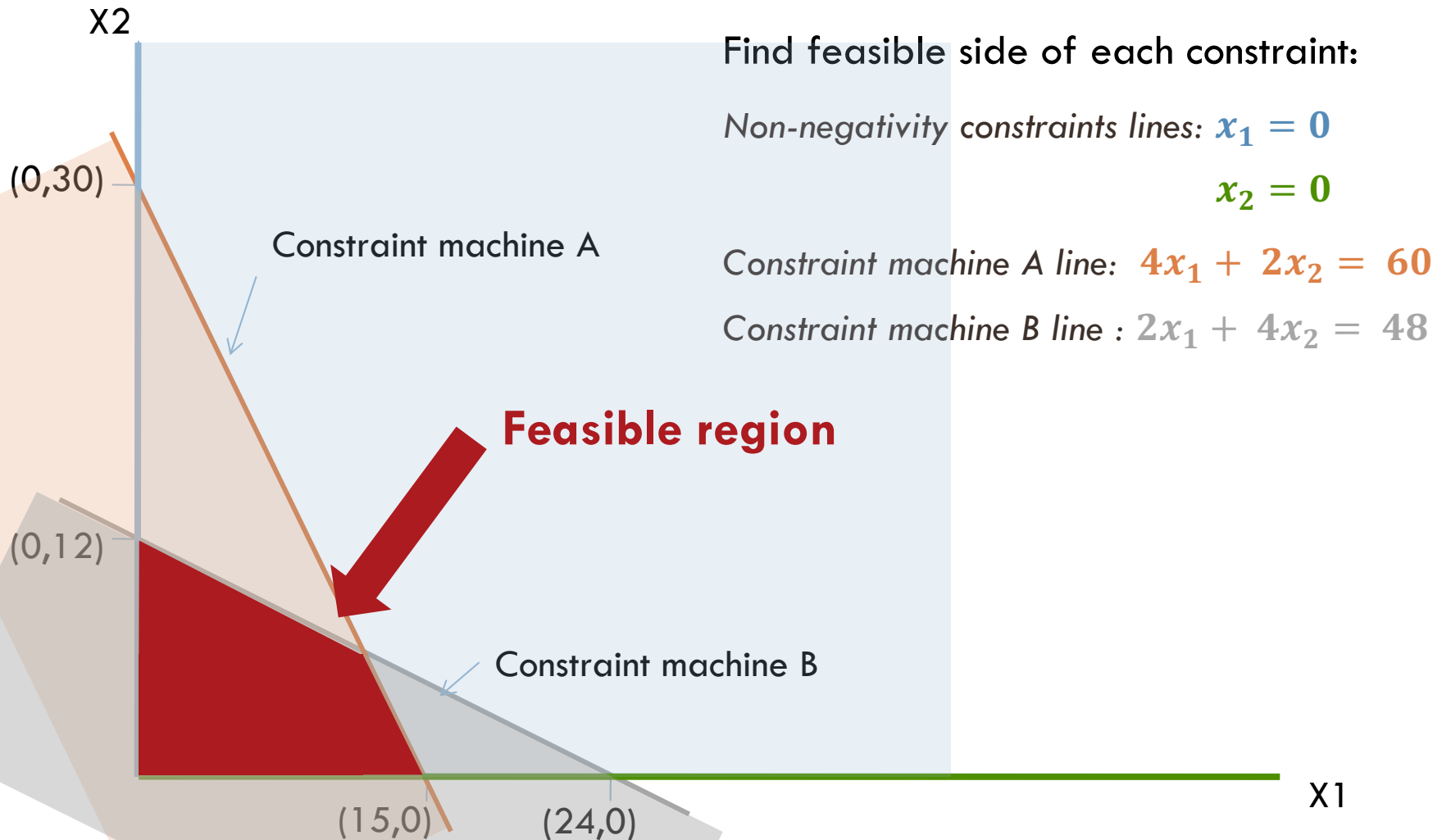
$x_2 = 0$

Constraint machine A line:  $4x_1 + 2x_2 = 60$

Constraint machine B line :  $2x_1 + 4x_2 = 48$



# Determine Feasible Region



# Graphical method

1. Formulate problem
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4. **Find optimal solution**
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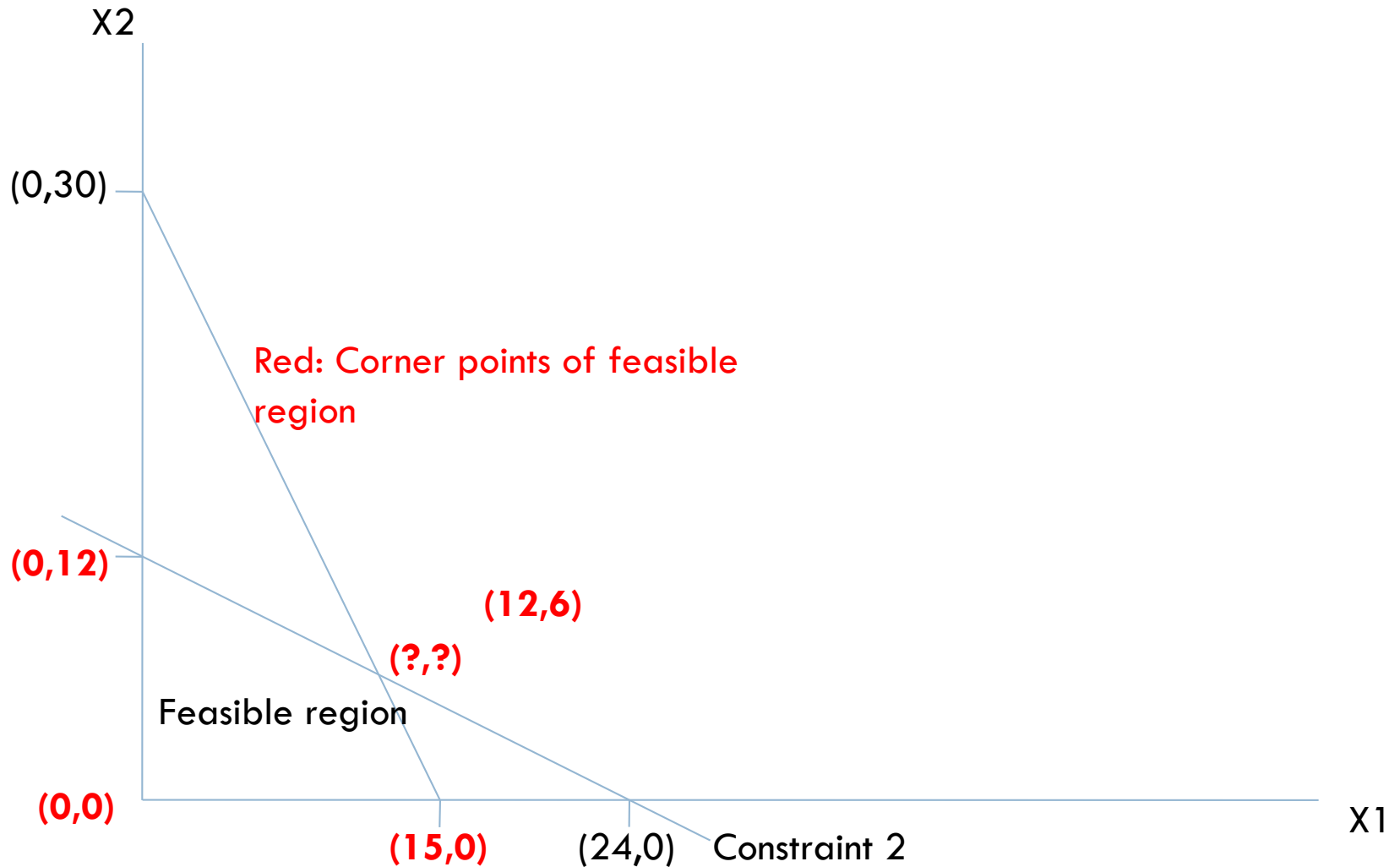
- ▣ Plot two objective function lines to determine direction of improvement. Choose corner and calculate value of objective function

# Step 4: Find optimal solution

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- Locate extreme points in the feasible region
- Calculate objective function for all corners

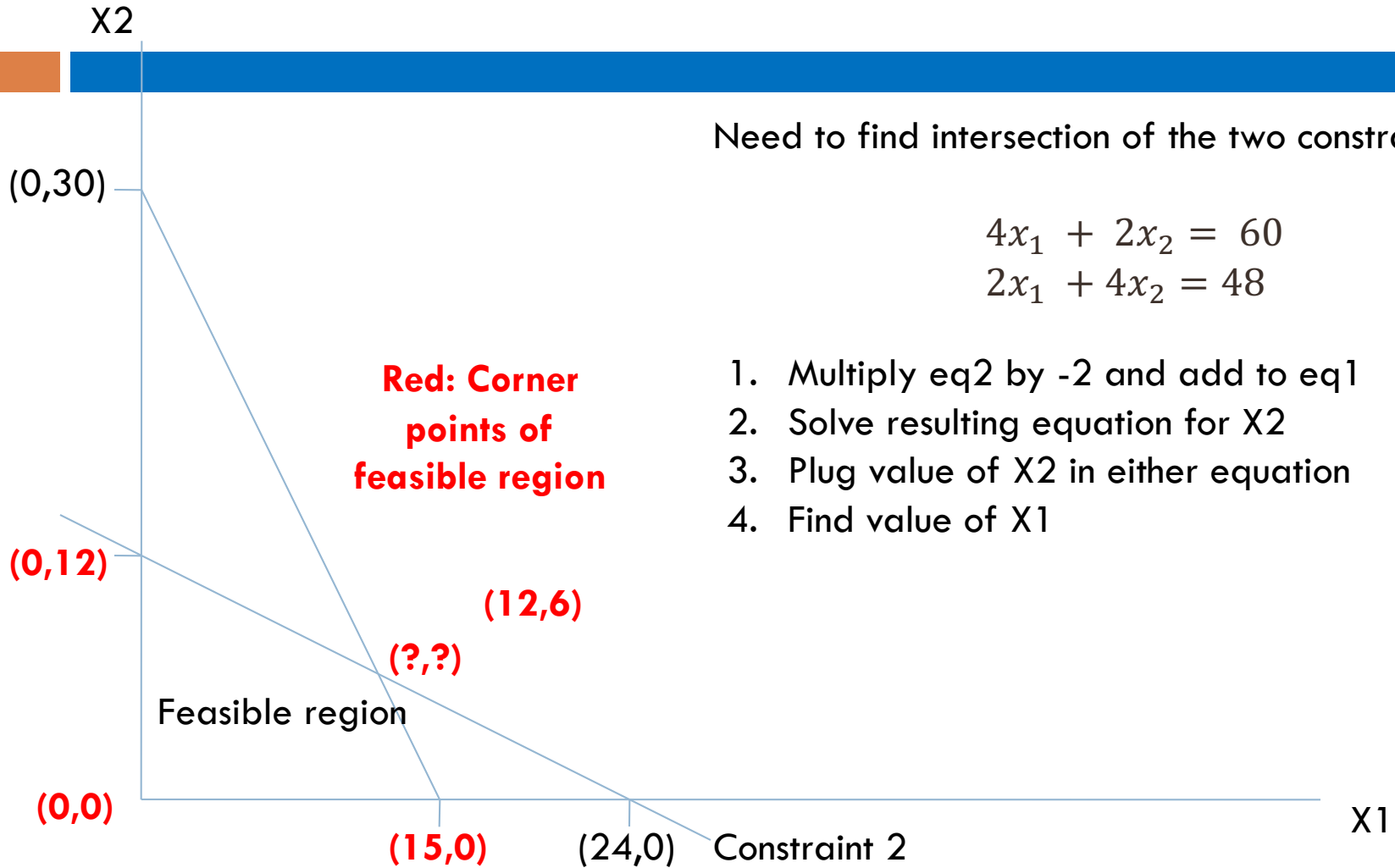
# Find Corner Points



# How do we find the intersection point?



# Find Corner Points



# Calculate objective function for all red corners

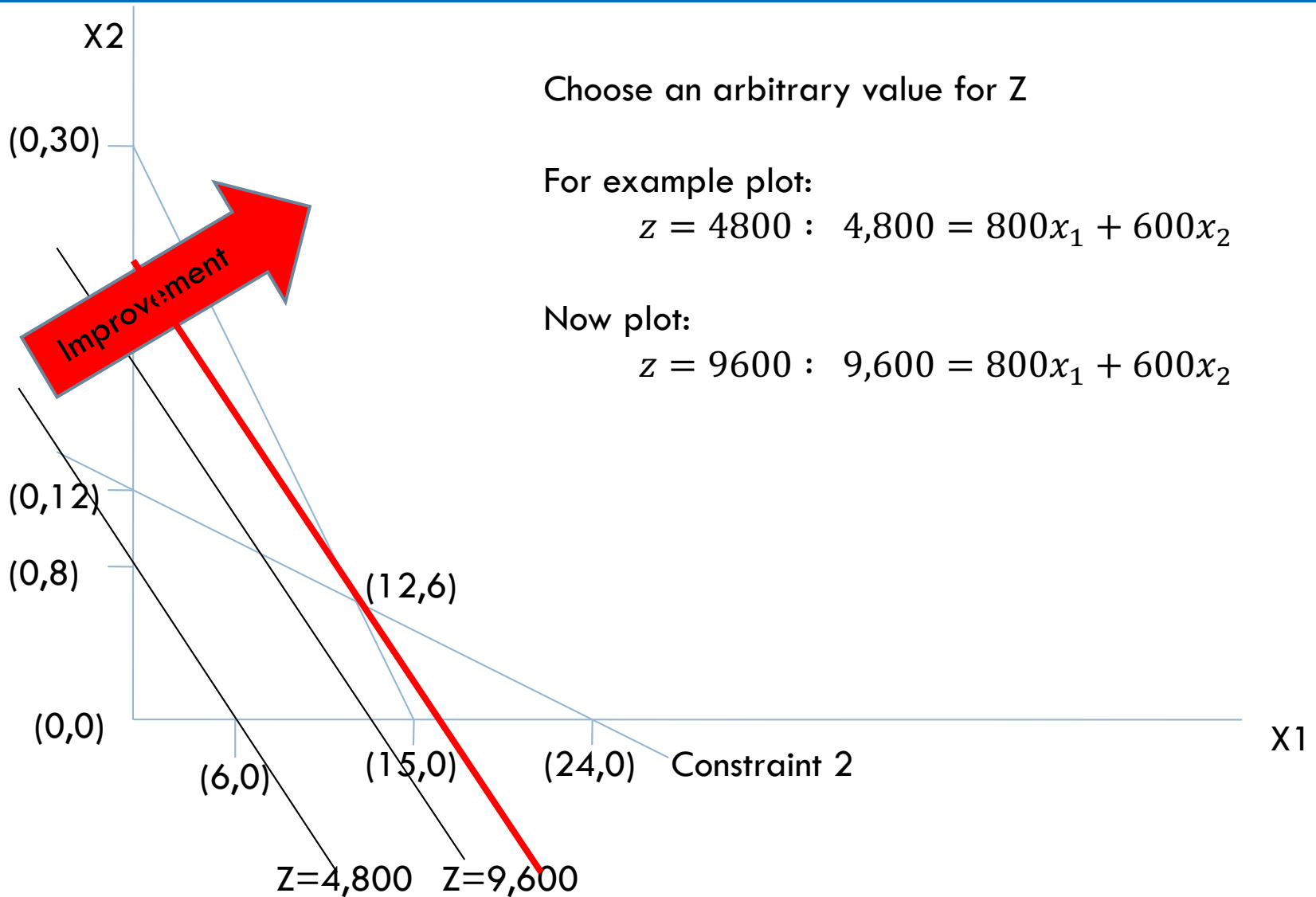
Feasible solutions: (X1,X2)	Hours used		Profits (Z)  =\$800X1+\$600X2
	Machine A =4X1+2X2	Machine B =2X1+4X2	
(0,0)	0	0	0
(0,12)	2*12=24	4*12=48	\$600*12=\$7,200
(15,0)	4*15=60	2*15=30	\$800*15=\$12,000
(12,6)	4*12+2*6=60	2*12+4*6=48	\$800*12+\$600*6=\$13,200

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Alternative to evaluating Z at all corner points: Plot objective function and see direction of improvement



# LP concepts



- Feasible region
- Feasible solution
- Objective function
- Decision variables
- Constraint (binding and non binding)

# LP assumptions

- **Proportionality:** Contribution to costs (or profits) of a variable is linear. No returns to scale / economies of scale
- **Additivity:** Total cost is sum of individual cost
- **Divisibility:** Decision variables can be divided into fractional levels (e.g. can make 5.2 water heaters)
- **Deterministic:** The cost coefficients, technical coefficients and RHS are all known deterministically



THANK YOU !

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