

Linear Programming

Models

“Programming” here means “Planning”

linear function

$$f(x_1, x_2, \dots, x_n) = c_0 + \sum_{i=1}^n c_i x_i$$
$$= c_0 + c_1 x_1 + c_2 x_2 + \dots + c_n x_n$$

examples

$$2x_1 + 5x_2 + x_3 + 1$$

$$x_1 - 3x_3$$

© 2014 Pearson Education, Inc. All rights reserved.

linear inequality

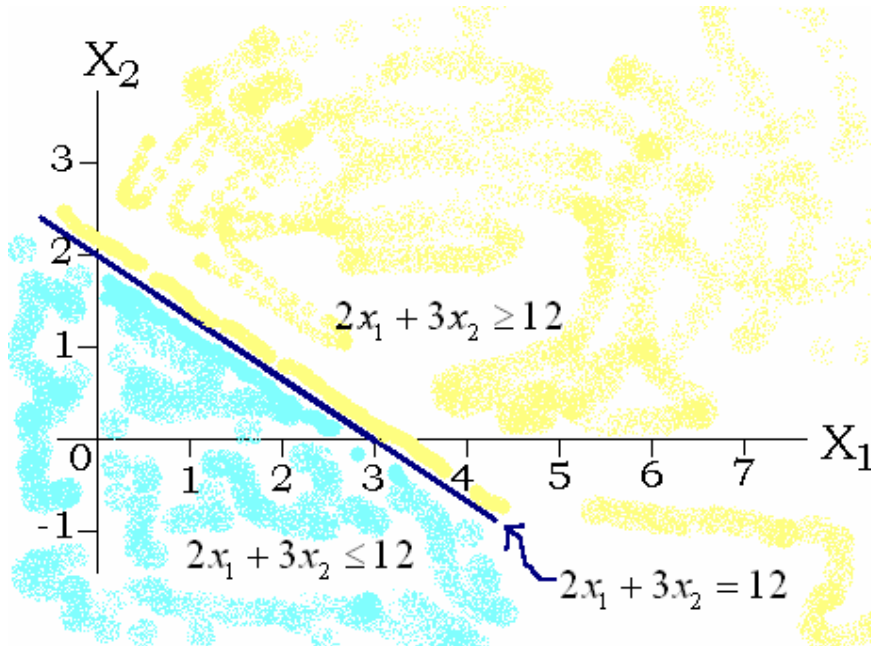
$$\sum_{i=1}^n a_i x_i \leq \text{ (or } \geq \text{) } b$$

examples

$$x_1 - 2x_2 \leq 5$$

$$2x_1 + x_2 - x_3 \geq -10$$

Graphical Representation



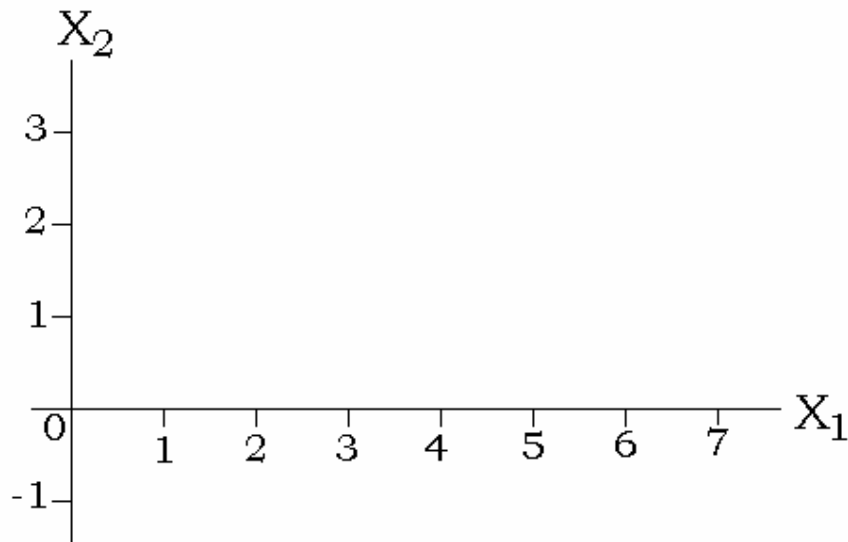
In *two* dimensions, the graph of a linear equation is a *line*, and the graph of a linear inequality is a *half-space* (including the line).

To draw the graph of a linear inequality, first draw the graph of the equation, and then decide which side is the correct half-space by testing whether (0,0) is feasible.

In *three* dimensions, the graph of a linear equation is a *plane*.

In *n* dimensions, the graph of a linear equation is a *hyperplane*.

Exercise

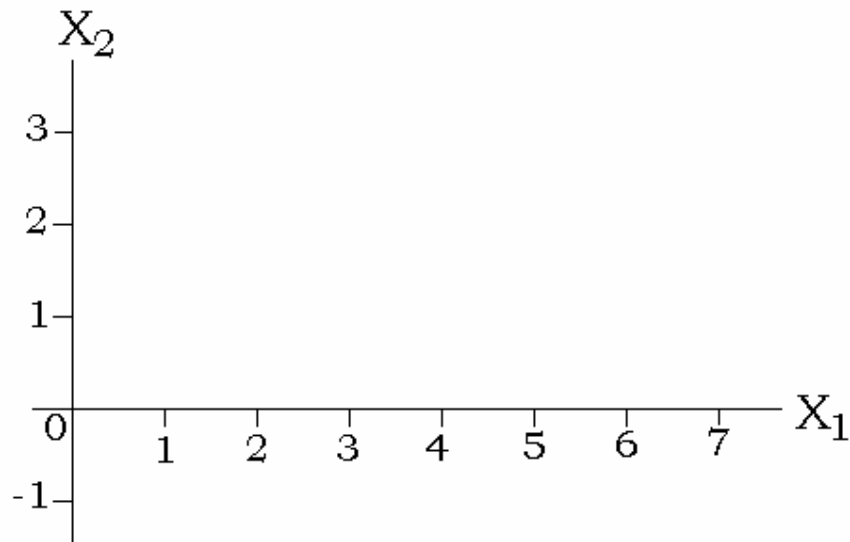


Graph the linear inequality:

$$X_1 - X_2 \leq 2$$

*(Shade the region representing points which are feasible in **both** inequalities.)*

(exercise, continued)



Graph the solutions of the pair of linear inequalities:

$$\begin{cases} X_1 - X_2 \leq 2 \\ X_1 + 3X_2 \geq 6 \end{cases}$$

*(Shade the region representing points which are feasible in **both** inequalities.)*

linear programming (LP): an optimization problem for which

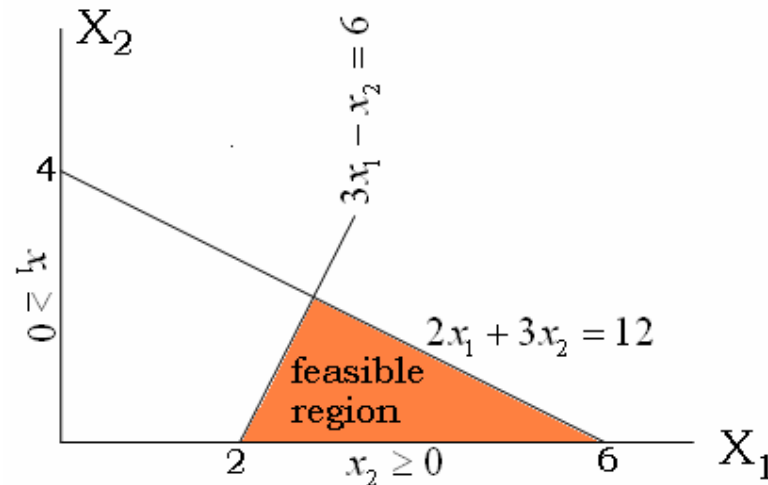
- we *maximize* or *minimize* a linear function of the *decision variables* (this function is called the *objective* function)
- the values of the decision variables must satisfy a set of *constraints*, each consisting of a linear equation or linear inequality
- a sign restriction, i.e., usually *nonnegativity* ($x_i \geq 0$) but perhaps *nonpositivity* ($x_i \leq 0$), may be associated with each decision variable.

example:

$$\begin{aligned} & \text{maximize } 2x_1 + x_2 \\ & \text{subject to } 3x_1 - x_2 \geq 6 \\ & \quad 2x_1 + 3x_2 \leq 12 \\ & \quad x_1 \geq 0, x_2 \geq 0 \end{aligned}$$

Graphical Representation

$$\begin{aligned} &\text{maximize } 2x_1 + x_2 \\ &\text{subject to } 3x_1 - x_2 \geq 6 \\ &\quad 2x_1 + 3x_2 \leq 12 \\ &\quad x_1 \geq 0, x_2 \geq 0 \end{aligned}$$



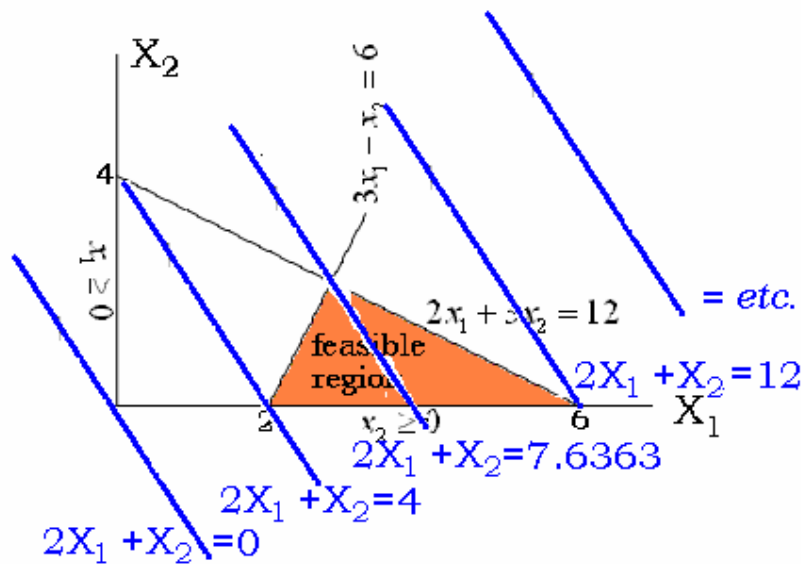
Each point in the shaded *feasible region* satisfies *all four* inequality constraints (including nonnegativity) and represents a possible solution of the problem.

The *optimal solution* is the feasible solution for which the objective function is largest.

By graphing the linear equations

$$2X_1 + X_2 = 0, \quad 2X_1 + X_2 = 4, \quad 2X_1 + X_2 = 12, \text{ etc.},$$

we see that the *slope remains the same*,
but the line is *shifted to the right*.



How far to the right can the line be shifted while still including a feasible solution of the set of inequalities?

The optimal solution is the corner farthest to the right, $(X_1, X_2) = (6, 0)$.

In fact, an optimal solution of an LP problem can always be found at a corner point!

Example:

- A manufacturer can make two products: P and Q.
- Each product requires processing time on each of four machines: A, B, C, and D.
- Each machine is available 24 hours per day = 1440 minutes per day.
- The profit per unit of products P and Q are \$45 and \$60, respectively.
- Maximum demand for products P and Q are 100/day and 40/day, respectively.

	Unit Processing Time (minutes)		
Machine \ Product:	P	Q	Available (min.)
A	20	10	1440
B	12	28	1440
C	15	6	1440
D	10	15	1440
Profit/unit	45	60	

How much of each product should be manufactured each day in order to maximize profits?

Define the decision variables

$P = \text{number of units/day of product } P$

$Q = \text{number of units/day of product } Q$

Objective: *Maximize* $45P + 60Q$ (\$/day)

Constraints: *do not exceed the available processing time on each machine:*

$$20P + 10Q \leq 1440$$

$$12P + 28Q \leq 1440$$

$$15P + 6Q \leq 1440$$

$$10P + 15Q \leq 1440$$

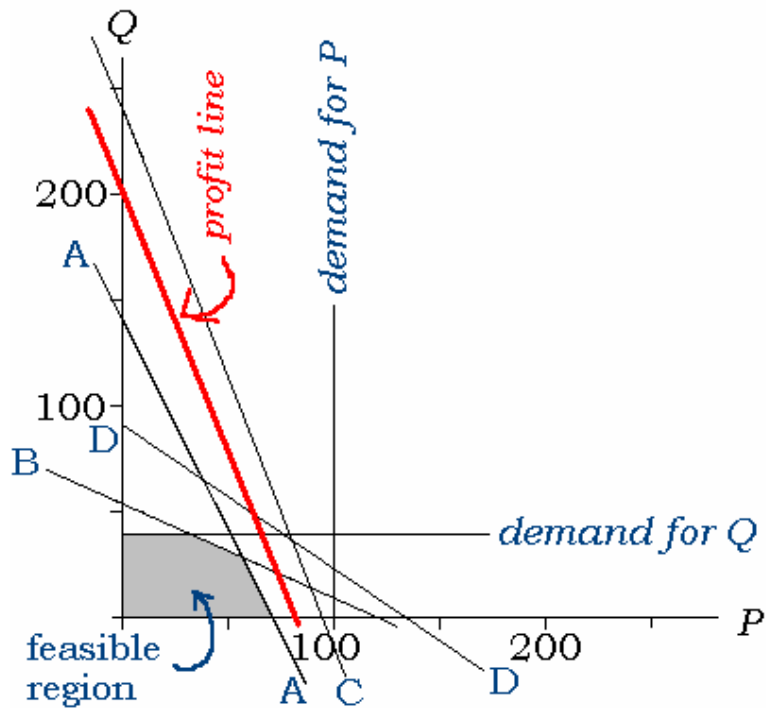
do not produce more than the demand for the products:

$$P \leq 100$$

$$Q \leq 40$$

a negative quantity of product is meaningless:

$$P \geq 0, Q \geq 0$$



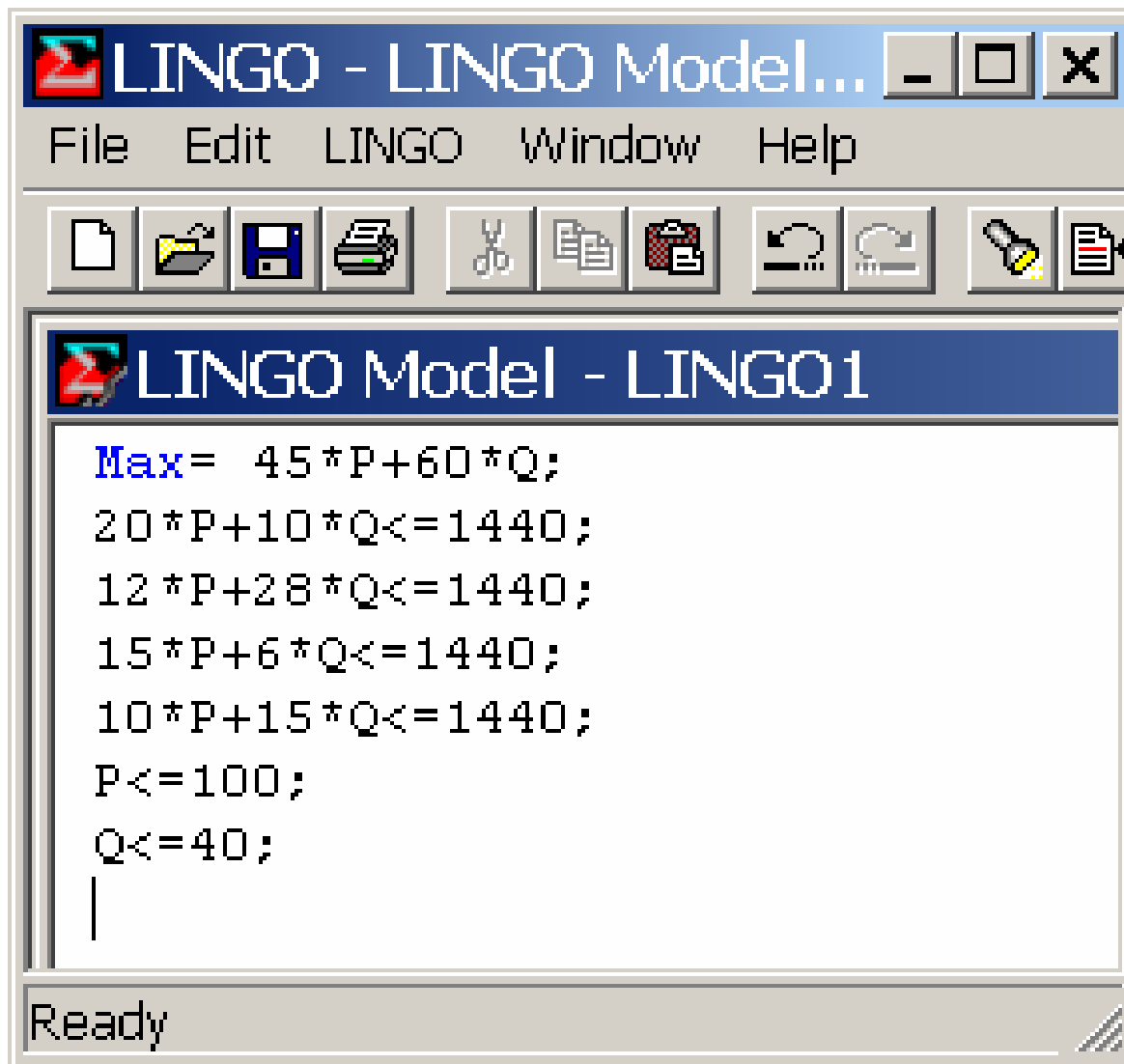
The maximum profit is obtained at the corner point $(P, Q) = (58.9, 26.2)$

Note: I clearly erred in drawing the isoquant line for the profit!

The **graphical method** for solving an LP problem is useless for problems with more than 2 (possibly 3) decision variables...

*Problems occurring in “the real world” may involve
a million decision variables and
thousands of constraints!*

We will study computational methods for solving linear programming problems.



LINGO is a software package for solving LP problems....

(by default, variables are assumed to be nonnegative.)

SOLUTION:

Global optimal solution found at step: 2
Objective value: 4221.818

Variable	Value	Reduced Cost
P	58.90909	0.000000
Q	26.18182	0.000000

Row	Slack or Surplus	Dual Price
1	4221.818	1.000000
2	0.000000	1.227273
3	0.000000	1.704545
4	399.2727	0.000000
5	458.1818	0.000000
6	41.09091	0.000000
7	13.81818	0.000000

That is, the manufacturer will maximize profits by producing 58.9 units of P and 26.18 units of Q each day (assuming fractional units are possible).

This plan will yield a profit of \$4221.818/day.

Row	Slack or Surplus	Dual Price
1	4221.818	1.000000
2	0.000000	1.227273
3	0.000000	1.704545
4	399.2727	0.000000
5	458.1818	0.000000
6	41.09091	0.000000
7	13.81818	0.000000

This plan will use all of the available time on machines A and B, i.e.,

$$S_A = S_B = 0$$

but unused time on machines C & D will be 399.27 and 458.18, respectively,

that is, $S_C = 399.2727$ and $S_D = 458.1818$.

Computational Methods for Solving LPs

It is more convenient to work with linear **equations** rather than linear inequalities.

Define “**slack**” variables S_A, S_B, S_C & S_D to be the **unused** processing time on machines A, B, C & D, respectively.

Then, for example, the inequality constraint for machine A is equivalent to the linear equation and nonnegativity restriction:

$$20P + 10Q \leq 1440 \quad \Leftrightarrow \quad 20P + 10Q + S_A = 1440 \text{ \& } S_A \geq 0$$

Thus we obtain the **system of equations** (& simple bounds on the variables):

$$\left\{ \begin{array}{l} 20P + 10Q \leq 1440 \\ 12P + 28Q \leq 1440 \\ 15P + 6Q \leq 1440 \\ 10P + 15Q \leq 1440 \end{array} \right. \Leftrightarrow \left\{ \begin{array}{l} 20P + 10Q + S_A = 1440 \\ 12P + 28Q + S_B = 1440 \\ 15P + 6Q + S_C = 1440 \\ 10P + 15Q + S_D = 1440 \\ 0 \leq P \leq 100, 0 \leq Q \leq 40, \\ S_A \geq 0, S_B \geq 0, S_C \geq 0, S_D \geq 0 \end{array} \right.$$

Next we will review computational methods for solving systems of linear equations!