Outline

Modeling

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2 Fundamental Steps





2 Fundamental Steps

Assumptions of the linear programming model





2 Fundamental Steps

Assumptions of the linear programming model

Forms of a linear program





Pundamental Steps

Assumptions of the linear programming model

Forms of a linear program

Motivating Examples

Models and Model Types Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

Need for models

Models and Model Types Fundamental Steps

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Need for models

Main Points

Linear Programming Linear Programming

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

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Most interesting decision problems occur in large and complex systems.

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

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- 2 The "what-if" question cannot be answered by trial and error.

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

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- 2 The "what-if" question cannot be answered by trial and error.
- Models can be "good" or "bad".

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

Need for models

Main Points

- Most interesting decision problems occur in large and complex systems.
- 2 The "what-if" question cannot be answered by trial and error.
- Models can be "good" or "bad".
- The solution to a model is different from a solution to the actual system.

Models and Model Types Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

Types of Models

Models and Model Types Fundamental Steps

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

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Types of Models

Model Types

Scale Model

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

Types of Models

Model Types

Scale Model - Aerodynamics.

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

Types of Models

- Scale Model Aerodynamics.
- 2 Pictorial Model

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

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- Scale Model Aerodynamics.
- 2 Pictorial Model Spatial relationships.

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

Types of Models

- Scale Model Aerodynamics.
- 2 Pictorial Model Spatial relationships.
- Flow Chart for Networks

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

Types of Models

- Scale Model Aerodynamics.
- 2 Pictorial Model Spatial relationships.
- Solution Flow Chart for Networks Functional relationships.

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

Types of Models

- Scale Model Aerodynamics.
- 2 Pictorial Model Spatial relationships.
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- Matrix

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

Types of Models

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- Matrix Table-representable relationships.

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

Types of Models

- Scale Model Aerodynamics.
- 2 Pictorial Model Spatial relationships.
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- Mathematical Model

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

Types of Models

- Scale Model Aerodynamics.
- 2 Pictorial Model Spatial relationships.
- Solution Flow Chart for Networks Functional relationships.
- Matrix Table-representable relationships.
- Mathematical Model Mathematical relationships captured by functions and equations.

Models and Model Types Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

Guidelines for Model Building

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

Guidelines for Model Building

General Guidelines

Linear Programming Linear Programming

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Guidelines for Model Building

General Guidelines

Primary purpose of model.

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- Primary purpose of model.
- 2 Requirements identification and Model type.

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

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- 3 Level of detail.

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

Guidelines for Model Building

General Guidelines

- Primary purpose of model.
- 2 Requirements identification and Model type.
- 3 Level of detail.
- Definition of input, output and relationships.

Models and Model Types Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

Important Terms

Models and Model Types Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

Important Terms

Definitions

Models and Model Types Fundamental Steps

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

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Variable.

Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

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Fundamental Steps Assumptions of the linear programming model Forms of a linear program Motivating Examples

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- Equation.
- Inequality.
- Objective.
- Constraint.

Basic Steps

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Formulating a linear program

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O Determine the decision (or control or structural) variables.

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- 2 Formulate the objective function.
- Formulate the constraints.

General Form of a Linear Program

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General Form

The general form of a linear programming is:

General Form of a Linear Program

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The general form of a linear programming is:

Optimize $z = c_1 \cdot x_1 + c_2 \cdot x_2 + \cdots + c_n \cdot x_n$

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$$\vdots$$

$$a_{m,1} \cdot x_1 + \cdots + a_{m,n} \cdot x_n \{ \leq , =, \text{ or } \geq \} b_m$$

General Form of a Linear Program

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$$\vdots$$

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$$x_1, \dots, x_n \geq 0$$

Compact representation

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Compact form

This can be written more compactly as

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Optimize $z = \sum_{j=1}^{n} c_j \cdot x_j$

Compact representation

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This can be written more compactly as

Optimize
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$$\sum_{i=1}^{n} a_{i,j} \cdot x_j \{ \leq =, \text{ or } \geq \} b_i$$
, for $i = 1, ..., m$

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Compact form

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subject to

$$\sum_{i=1}^{n} a_{i,j} \cdot x_{j} \{ \leq =, \text{ or } \geq \} b_{i}, \text{ for } i = 1, \dots, m$$

 $x_i \geq 0$ for $i = 1, \ldots, n$

Assumptions

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Linear Programming Linear Programming

Assumptions

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Certainty

Linear Programming Linear Programming

Assumptions

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Certainty - No stochastics in problem parameters.

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- Proportionality

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- Additivity Total cost is the sum of cost contributions of each variable. No interactions reduce or increase the level of the combined contributions
- Oivisibility Variables are continuous and not discrete.

Forms of a linear program

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Linear Programming

Forms of a linear program

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General Form (Already discussed).

Forms of a linear program

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Forms of a linear program

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 $\begin{array}{ccc} \max \mathbf{c} \cdot \mathbf{x} \\ \mathbf{A} \cdot \mathbf{x} &\leq \mathbf{b} \\ \mathbf{x} &\geq \mathbf{0} \end{array}$

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3 Standard form:

Models and Model Types **Fundamental Steps** Assumptions of the linear programming model Motivating Examples

Forms of a linear program

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anonical form:			
	max c · x		
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Standard form:			
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Converting linear programs into standard form

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Objective function

If already in maximization form, nothing needs to be done.

Converting linear programs into standard form

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Variables

If a variable (say x_1) is unrestricted in sign, replace it with $x'_1 - x''_1$, where both $x'_1, x''_1 \ge 0$.

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• If a constraint is in the \leq form, use a slack variable.

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- If a constraint is in the \leq form, use a slack variable.
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Constraints

- If a constraint is in the \leq form, use a slack variable.
- 2 If a constraint is in the \geq form, use a surplus variable.

Both slack and surplus variables are inherently non-negative.

Equivalence of the feasibility and optimization versions

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Equivalence

Linear Programming

Motivating Examples

Equivalence of the feasibility and optimization versions

Equivalence

O Can you solve the feasibility version of linear programs, given an oracle for the optimization version?

Motivating Examples

Equivalence of the feasibility and optimization versions

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Exercise

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Exercise on constraint conversion

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Exercise on constraint conversion

Convert the following Linear Program into Standard Form.

Minimize $z = 2 \cdot x_1 - 3 \cdot x_2 + 5 \cdot x_3 + x_4$

Exercise

Exercise on constraint conversion

Convert the following Linear Program into Standard Form.

Minimize $z = 2 \cdot x_1 - 3 \cdot x_2 + 5 \cdot x_3 + x_4$

subject to

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Exercise on constraint conversion

Convert the following Linear Program into Standard Form.

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Solution

Solution

Constraint conversion

Linear Programming Linear Programming

Solution

Constraint conversion

Converting the constraints we get,

Solution

Constraint conversion

Converting the constraints we get,

$$-x_1 + 3 \cdot x_2 - x_3 + 2 \cdot x_4 + s_1 = -12$$

$$5 \cdot x_1 + x_2 + 4 \cdot x_3 - x_4 - s_2 = 10$$

$$3 \cdot x_1 - 2 \cdot x_2 + x_3 - x_4 = -8$$

Solution

Constraint conversion

Converting the constraints we get,

$$\begin{aligned} -x_1 + 3 \cdot x_2 - x_3 + 2 \cdot x_4 + s_1 &= -12 \\ 5 \cdot x_1 + x_2 + 4 \cdot x_3 - x_4 - s_2 &= 10 \\ 3 \cdot x_1 - 2 \cdot x_2 + x_3 - x_4 &= -8 \end{aligned}$$

Adding the bounds on the slack and surplus variables

 $x_1, x_2, x_3, x_4, s_1, s_2 \ge 0$

Solution

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Finally, converting the objective function
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Adding the bounds on the slack and surplus variables

 $x_1, x_2, x_3, x_4, s_1, s_2 \ge 0$

Finally, converting the objective function

Maximize
$$z = -2 \cdot x_1 + 3 \cdot x_2 - 5 \cdot x_3 - x_4 + 0s_1 + 0s_2$$

A Classification problem

A Classification problem

Example

Linear Programming Linear Programming

A Classification problem

Example

• Assume that you measure the heights and weights of *n* Danish men and *m* Danish women.

A Classification problem

Example

- Assume that you measure the heights and weights of *n* Danish men and *m* Danish women.
- 2 This data is plotted as points on the x y plane.

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- Assume that you measure the heights and weights of *n* Danish men and *m* Danish women.
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The goal is to find a linear classifier

A Classification problem

Example

- Assume that you measure the heights and weights of *n* Danish men and *m* Danish women.
- 2 This data is plotted as points on the x y plane.

The goal is to find a linear classifier (straight line) that separates the points representing the Danish men from the Danish women.

A product mix problem

A product mix problem

Example

Linear Programming Linear Programming

A product mix problem

Example

A product mix problem

Example

We have two gadgets to produce: α and β .

• The return for a unit of α is \$20.

A product mix problem

Example

- The return for a unit of α is \$20.
- 2 Each unit of α requires 4 hours of assembly and 1 hour of testing.

A product mix problem

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- **(3)** We must produce at least 25 units of α .

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- **③** We must produce at least 25 units of α .
- We have a total of 240 hours available for assembly and 140 hours for testing.

A product mix problem

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We have two gadgets to produce: α and β .

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- We have a total of 240 hours available for assembly and 140 hours for testing.

How many units of α and β should be produced to maximize our return?

Modeling the product mix problem

Modeling the product mix problem

Decision Variables

Modeling the product mix problem

Decision Variables

Let x_1 denote the number of units of α and x_2 denote the number of units of β to be manufactured.

Modeling the product mix problem

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Objective function

Modeling the product mix problem

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Objective function

 $\max 20 \cdot x_1 + 30 \cdot x_2$.

Modeling the product mix problem

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$$4 \cdot x_1 + 3 \cdot x_2 \le 240$$

Modeling the product mix problem

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Portfolio optimization

Portfolio optimization

Example

Linear Programming Linear Programming

Portfolio optimization

Example

Portfolio optimization

Example

We want to invest \$50,000 among three strategies: savings certificates, municipal bonds, and stocks.

• The annual return on each investment is 7%, 9%, and 14% respectively.

Portfolio optimization

Example

- The annual return on each investment is 7%, 9%, and 14% respectively.
- 2 We will not re-invest the interest at the end of the year.

Portfolio optimization

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- The annual return on each investment is 7%, 9%, and 14% respectively.
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- We do not want to invest less than \$10,000 in bonds.

Portfolio optimization

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- We do not want to invest less than \$10,000 in bonds.
- The investment in stocks should not exceed the combined total investment in the other two strategies.

Portfolio optimization

Example

- The annual return on each investment is 7%, 9%, and 14% respectively.
- 2 We will not re-invest the interest at the end of the year.
- We do not want to invest less than \$10,000 in bonds.
- The investment in stocks should not exceed the combined total investment in the other two strategies.
- The savings certificate investment should be between \$5,000 and \$15,000.
Portfolio optimization

Example

We want to invest \$50,000 among three strategies: savings certificates, municipal bonds, and stocks.

- The annual return on each investment is 7%, 9%, and 14% respectively.
- 2 We will not re-invest the interest at the end of the year.
- We do not want to invest less than \$10,000 in bonds.
- The investment in stocks should not exceed the combined total investment in the other two strategies.
- The savings certificate investment should be between \$5,000 and \$15,000.

How should we invest the money in order to maximize our return?

Modeling the portfolio optimization problem

Modeling the portfolio optimization problem

Decision Variables

Modeling the portfolio optimization problem

Decision Variables

Let x_1 , x_2 and x_3 denote the amounts to be invested in savings certificates, municipal bonds and stocks respectively.

Modeling the portfolio optimization problem

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Objective Function

Modeling the portfolio optimization problem

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Let x_1 , x_2 and x_3 denote the amounts to be invested in savings certificates, municipal bonds and stocks respectively.

Objective Function

 $\max 0.07 \cdot x_1 + 0.09 \cdot x_2 + 0.14 \cdot x_3.$

Modeling the portfolio optimization problem

Decision Variables

Let x_1 , x_2 and x_3 denote the amounts to be invested in savings certificates, municipal bonds and stocks respectively.

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 $\max 0.07 \cdot x_1 + 0.09 \cdot x_2 + 0.14 \cdot x_3.$

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$$x_2 \geq 10,000$$

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 $\max 0.07 \cdot x_1 + 0.09 \cdot x_2 + 0.14 \cdot x_3.$

$$x_2 \ge 10,000$$

 $x_3 \le x_1 + x_2$

Modeling the portfolio optimization problem

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 $\max 0.07 \cdot x_1 + 0.09 \cdot x_2 + 0.14 \cdot x_3.$

$$egin{array}{rcl} x_2 &\geq & 10,000 \ x_3 &\leq & x_1+x_2 \ x_1 &\geq & 5000 \end{array}$$

Modeling the portfolio optimization problem

Decision Variables

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 $\max 0.07 \cdot x_1 + 0.09 \cdot x_2 + 0.14 \cdot x_3.$

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 $\max 0.07 \cdot x_1 + 0.09 \cdot x_2 + 0.14 \cdot x_3.$

Constraints

X

Farmland Use

Farmland Use

Example

Linear Programming Linear Programming

Farmland Use

Example

Farmland Use

Example

We own 500 acres of land, in which we grow corn, wheat, soybeans and oats.

An acre yields 110 bushels of corn,

Farmland Use

Example

We own 500 acres of land, in which we grow corn, wheat, soybeans and oats.

An acre yields 110 bushels of corn, 35 bushels of wheat,

Farmland Use

Example

We own 500 acres of land, in which we grow corn, wheat, soybeans and oats.

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Farmland Use

Example

We own 500 acres of land, in which we grow corn, wheat, soybeans and oats.

 An acre yields 110 bushels of corn, 35 bushels of wheat, 32 bushels of soybeans, and 55 bushels of oats.

Farmland Use

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Farmland Use

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- We require at least 10,000 bushels of corn product due to a contract with a local dairy farm.

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- The selling price per bushel of corn is \$0.36; of wheat, \$0.90; of soybeans, \$0.82; of oats, \$0.98.

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How many acres of each product should be grown to maximize our profit?

Modeling the Farmland Use problem

Modeling the Farmland Use problem

Decision Variables

Modeling the Farmland Use problem

Decision Variables

Let x_1 , x_2 , x_3 and x_4 denote the acreage of corn, what, soybeans and oats respectively.

Modeling the Farmland Use problem

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Objective Function

Modeling the Farmland Use problem

Decision Variables

Let x_1 , x_2 , x_3 and x_4 denote the acreage of corn, what, soybeans and oats respectively.

Objective Function

 $\max(0.36) \cdot 110 \cdot x_1 + (0.9) \cdot 35 \cdot x_2 + (0.82) \cdot 32 \cdot x_3 + (0.98) \cdot 55 \cdot x_4.$

Modeling the Farmland Use problem

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 $\max(0.36) \cdot 110 \cdot x_1 + (0.9) \cdot 35 \cdot x_2 + (0.82) \cdot 32 \cdot x_3 + (0.98) \cdot 55 \cdot x_4.$

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$$x_1 + x_2 + x_3 + x_4 \leq 500$$

Modeling the Farmland Use problem

Decision Variables

Let x_1 , x_2 , x_3 and x_4 denote the acreage of corn, what, soybeans and oats respectively.

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 $\max(0.36) \cdot 110 \cdot x_1 + (0.9) \cdot 35 \cdot x_2 + (0.82) \cdot 32 \cdot x_3 + (0.98) \cdot 55 \cdot x_4.$

$$\begin{array}{rrrrr} x_1 + x_2 + x_3 + x_4 & \leq & 500 \\ x_3 & \leq & 120 \end{array}$$

Modeling the Farmland Use problem

Decision Variables

Let x_1 , x_2 , x_3 and x_4 denote the acreage of corn, what, soybeans and oats respectively.

Objective Function

 $\max(0.36) \cdot 110 \cdot x_1 + (0.9) \cdot 35 \cdot x_2 + (0.82) \cdot 32 \cdot x_3 + (0.98) \cdot 55 \cdot x_4.$
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Constraints

Modeling the Farmland Use problem

Decision Variables

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 $\max(0.36) \cdot 110 \cdot x_1 + (0.9) \cdot 35 \cdot x_2 + (0.82) \cdot 32 \cdot x_3 + (0.98) \cdot 55 \cdot x_4.$

Constraints

Transportation

Transportation

Example

Linear Programming Linear Programming

Transportation

Example

Transportation

Example

We have three warehouses and four clients.

Warehouses 1, 2, and 3 have 6, 000, 9, 000, and 4, 000 units available respectively.

Transportation

Example

- Warehouses 1, 2, and 3 have 6, 000, 9, 000, and 4, 000 units available respectively.
- Clients 1, 2, 3, and 4 want 3, 900, 5, 200, 2, 700, and 6, 400 units respectively.

Transportation

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- Warehouses 1, 2, and 3 have 6, 000, 9, 000, and 4, 000 units available respectively.
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- The cost to ship a unit from a given warehouse to a given client varies according to the following table:

Transportation

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	Client				
Warehouse	1	2	3	4	
1	7	3	8	4	
2	8	5	6	3	
3	4	6	9	6	

Transportation

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	Client				
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2	8	5	6	3	
3	4	6	9	6	

 Items should be shipped from warehouses to clients, so all client demands are met.

Transportation

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3	4	6	9	6	

 Items should be shipped from warehouses to clients, so all client demands are met.

How can we perform the shipping while minimizing our shipping cost?

Modeling the Transportation problem

Modeling the Transportation problem

Decision Variables

Linear Programming Linear Programming

Modeling the Transportation problem

Decision Variables

Let $x_{i,j}$ denote the number of units to be shipped from warehouse *i* to client *j*, where $i \in \{1, 2, 3\}$ and $j \in \{1, 2, 3, 4\}$.

Modeling the Transportation problem

Decision Variables

Let $x_{i,j}$ denote the number of units to be shipped from warehouse *i* to client *j*, where $i \in \{1, 2, 3\}$ and $j \in \{1, 2, 3, 4\}$.

Objective Function

Modeling the Transportation problem

Decision Variables

Let $x_{i,j}$ denote the number of units to be shipped from warehouse *i* to client *j*, where $i \in \{1, 2, 3\}$ and $j \in \{1, 2, 3, 4\}$.

Objective Function

min
$$7 \cdot x_{1,1} + 3 \cdot x_{1,2} + 8 \cdot x_{1,3} + 4 \cdot x_{1,4}$$

 $9 \cdot x_{2,1} + 5 \cdot x_{2,2} + 6 \cdot x_{2,3} + 3 \cdot x_{2,4}$
 $4 \cdot x_{3,1} + 6 \cdot x_{3,2} + 9 \cdot x_{3,3} + 6 \cdot x_{3,4}$

Modeling (contd.)

Modeling (contd.)

Constraints

Linear Programming Linear Programming

Modeling (contd.)

Constraints

Modeling (contd.)

Constraints

$$\sum_{j=1}^{4} x_{1,j} \leq 6000$$

Modeling (contd.)

Constraints

$$\sum_{j=1}^{4} x_{1,j} \leq 6000$$
$$\sum_{j=1}^{4} x_{2,j} \leq 9000$$

Modeling (contd.)

Constraints

$$\sum_{j=1}^{4} x_{1,j} \leq 6000$$
$$\sum_{j=1}^{4} x_{2,j} \leq 9000$$
$$\sum_{i=1}^{4} x_{3,j} \leq 4000$$

Modeling (contd.)

Constraints

The supply constraints:

$$\sum_{j=1}^{4} x_{1,j} \leq 6000$$
$$\sum_{j=1}^{4} x_{2,j} \leq 9000$$
$$\sum_{j=1}^{4} x_{3,j} \leq 4000$$

Modeling (contd.)

Constraints

The supply constraints:

$$\sum_{j=1}^{4} x_{1,j} \leq 6000$$

 $\sum_{j=1}^{4} x_{2,j} \leq 9000$
 $\sum_{i=1}^{4} x_{3,j} \leq 4000$

$$\sum_{i=1}^{3} x_{i,1} = 3900$$

Modeling (contd.)

Constraints

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 $\sum_{j=1}^{4} x_{2,j} \leq 9000$
 $\sum_{j=1}^{4} x_{3,j} \leq 4000$

$$\sum_{i=1}^{3} x_{i,1} = 3900$$
$$\sum_{i=1}^{3} x_{i,2} = 5200$$

Modeling (contd.)

Constraints

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$$\sum_{i=1}^{3} x_{i,3} = 2700$$

Modeling (contd.)

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$$\sum_{i=1}^{3} x_{i,4} = 6400$$

Modeling (contd.)

Constraints

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The demand constraints:

$$\sum_{i=1}^{3} x_{i,1} = 3900$$
$$\sum_{i=1}^{3} x_{i,2} = 5200$$
$$\sum_{i=1}^{3} x_{i,3} = 2700$$
$$\sum_{i=1}^{3} x_{i,4} = 6400$$

Non-negativity constraints: $x_{ij} \ge 0, i = 1, 2, 3, j = 1, 2, 3, 4.$

Short-term financing

Short-term financing

The problem

Short-term financing

The problem

• Companies routinely face the problem of short-term commitments.

Short-term financing

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- **2** We need an optimal combination of financial instruments to meet those commitments.

Short-term financing

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- Onsider the following table:

Month	Jan	Feb	March	April	May	June
Net Cash flow	-150 <i>K</i>	-100 <i>K</i>	200 K	-200 K	50 K	300 K

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Net Cash flow	-150 <i>K</i>	-100 K	200 K	-200 K	50 K	300 K

• The company has a credit line of \$100 K at an interest rate of 1% per month.

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Net Cash flow	-150 <i>K</i>	-100 K	200 K	-200 K	50 K	300 K

- The company has a credit line of \$100 K at an interest rate of 1% per month.
- In any of the first three months, it can issue 90-day commercial paper.

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- Second Se
Short-term financing

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Net Cash flow	-150 <i>K</i>	-100 K	200 K	-200 K	50 K	300 K

- The company has a credit line of \$100 K at an interest rate of 1% per month.
- In any of the first three months, it can issue 90-day commercial paper.
- Excess funds can be reinvested at an interest rate of 0.3% per month.
- Any paper issued in January through March requires a 2% interest rate payment three months later.

Modeling

Modeling

Decision Variables

Linear Programming Linear Programming

Modeling

Decision Variables

Modeling

Decision Variables

Let

• x_i denote the amount drawn from the credit line in month *i*,

Modeling

Decision Variables

- **(**) x_i denote the amount drawn from the credit line in month *i*,
- 2 y_i denote the amount of commercial paper issued in month *i*,

Modeling

Decision Variables

- **(**) x_i denote the amount drawn from the credit line in month *i*,
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Modeling

Decision Variables

- **(**) x_i denote the amount drawn from the credit line in month *i*,
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- v denote the company's wealth after June.

Modeling

Decision Variables

Let

- **(**) x_i denote the amount drawn from the credit line in month *i*,
- 2 y_i denote the amount of commercial paper issued in month *i*,
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- v denote the company's wealth after June.

Objective Function

Modeling

Decision Variables

Let

- **(**) x_i denote the amount drawn from the credit line in month *i*,
- 2 y_i denote the amount of commercial paper issued in month *i*,
- 3 z_i denote the excess funds in month *i*, and
- v denote the company's wealth after June.

Objective Function

max v

Modeling (contd.)

Modeling (contd.)

Constraints

Linear Programming Linear Programming

Modeling (contd.)

Constraints

 $x_1 + y_1 - z_1 = 150$

Modeling (contd.)

$$x_1 + y_1 - z_1 = 150$$

$$x_2 + y_2 - 1.01 \cdot x_1 + 1.003 \cdot z_1 - z_2 = 100$$

Modeling (contd.)

$$x_1 + y_1 - z_1 = 150$$

$$x_2 + y_2 - 1.01 \cdot x_1 + 1.003 \cdot z_1 - z_2 = 100$$

$$x_3 + y_3 - 1.01 \cdot x_2 + 1.003 \cdot z_2 - z_3 = -200$$

Modeling (contd.)

$$\begin{aligned} x_1 + y_1 - z_1 &= 150\\ x_2 + y_2 - 1.01 \cdot x_1 + 1.003 \cdot z_1 - z_2 &= 100\\ x_3 + y_3 - 1.01 \cdot x_2 + 1.003 \cdot z_2 - z_3 &= -200\\ x_4 - 1.02 \cdot y_1 - 1.01 \cdot x_3 + 1.003 \cdot z_3 - z_4 &= 200 \end{aligned}$$

Modeling (contd.)

$$\begin{aligned} x_1 + y_1 - z_1 &= 150\\ x_2 + y_2 - 1.01 \cdot x_1 + 1.003 \cdot z_1 - z_2 &= 100\\ x_3 + y_3 - 1.01 \cdot x_2 + 1.003 \cdot z_2 - z_3 &= -200\\ x_4 - 1.02 \cdot y_1 - 1.01 \cdot x_3 + 1.003 \cdot z_3 - z_4 &= 200\\ x_5 - 1.02 \cdot y_2 - 1.01 \cdot x_4 + 1.003 \cdot z_4 - z_5 &= -50 \end{aligned}$$

Modeling (contd.)

$$\begin{aligned} x_1 + y_1 - z_1 &= 150\\ x_2 + y_2 - 1.01 \cdot x_1 + 1.003 \cdot z_1 - z_2 &= 100\\ x_3 + y_3 - 1.01 \cdot x_2 + 1.003 \cdot z_2 - z_3 &= -200\\ x_4 - 1.02 \cdot y_1 - 1.01 \cdot x_3 + 1.003 \cdot z_3 - z_4 &= 200\\ x_5 - 1.02 \cdot y_2 - 1.01 \cdot x_4 + 1.003 \cdot z_4 - z_5 &= -50\\ - 1.02 \cdot y_3 - 1.01 \cdot x_5 + 1.003 \cdot z_5 - v &= -300 \end{aligned}$$

Modeling (contd.)

$$\begin{array}{rclrcrcrc} x_1+y_1-z_1 &=& 150\\ x_2+y_2-1.01\cdot x_1+1.003\cdot z_1-z_2 &=& 100\\ x_3+y_3-1.01\cdot x_2+1.003\cdot z_2-z_3 &=& -200\\ x_4-1.02\cdot y_1-1.01\cdot x_3+1.003\cdot z_3-z_4 &=& 200\\ x_5-1.02\cdot y_2-1.01\cdot x_4+1.003\cdot z_4-z_5 &=& -50\\ -1.02\cdot y_3-1.01\cdot x_5+1.003\cdot z_5-v &=& -300\\ x_i &\leq& 100, \ i=1,2,3,4,5 \end{array}$$

Modeling (contd.)

$$\begin{array}{rcl} x_1 + y_1 - z_1 &=& 150 \\ x_2 + y_2 - 1.01 \cdot x_1 + 1.003 \cdot z_1 - z_2 &=& 100 \\ x_3 + y_3 - 1.01 \cdot x_2 + 1.003 \cdot z_2 - z_3 &=& -200 \\ x_4 - 1.02 \cdot y_1 - 1.01 \cdot x_3 + 1.003 \cdot z_3 - z_4 &=& 200 \\ x_5 - 1.02 \cdot y_2 - 1.01 \cdot x_4 + 1.003 \cdot z_4 - z_5 &=& -50 \\ - 1.02 \cdot y_3 - 1.01 \cdot x_5 + 1.003 \cdot z_5 - v &=& -300 \\ x_i &\leq& 100, \ i = 1, 2, 3, 4, 5 \\ x_i, y_i, z_i &\geq& 0 \end{array}$$

Final points

Final points

Choice of variables

Linear Programming Linear Programming

Final points

Choice of variables

() Why was the interest on x_1 not included in the equation for March?

Final points

Choice of variables

Why was the interest on x₁ not included in the equation for March?

2 Choice of variables is crucial.