## Optimization Models and Applications

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ISE 316, Fall 2014, Lecture 1

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## **Outline**

- Course Information
- Example of an Optimization Problem
- Terminology and Formal Formulation
- General Optimization Problem
- Solving of an Optimization Problem in Excel

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## Part I. Course Information

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## What is it about?

#### Theory

- Linear Programming (LP)
- Integer Programming (IP)
- Nonlinear Programming (NP)
- Robust Optimization, Stochastic Programming and Multi-criteria Programming

#### **Practice**

- Modeling
- Solving problems using Excel Solver and AMPL

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## 1st rule

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### 1st rule

## There are no stupid questions!

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## Evaluation

Homework	25%
Quiz #1	20%
Quiz #2	25%
Case study	20%
Class participation	10%

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#### Homework

- Several homework
- · All must be completed to receive a grade for the course
- Require modeling and solving simple problems
- · Homework will be penalized for each day they are late
- After solutions are released, they will not be accepted
- No exceptions! Also, no exception to the no-exception rule!

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## Case study

- Is a hands-on experience on real Optimization problems
- It must be completed to receive a grade
- Groups of three-four people study an Optimization problem, propose a model and solve it using a tool of their choice
- The result is a short report on the whole experience
- There will be an informal discussion after the beginning of the study and another after the report is due

#### Which skills I will gain?

- Report writing
- Group work
- Presentation
- Consultancy

"This is something I can talk about in job interviews!"

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### **Textbooks**

- Select chapters of Introduction to Operations Research by F.S. Hiller and G.J. Lieberman
- Select chapters of Introduction to Mathematical Programming: Applications and Algorithms by W.L.
   Winston and M. Venkataramanan
- Select chapters of Operations Research: Applications and Algorithms by Wayne L. Winston

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## Software

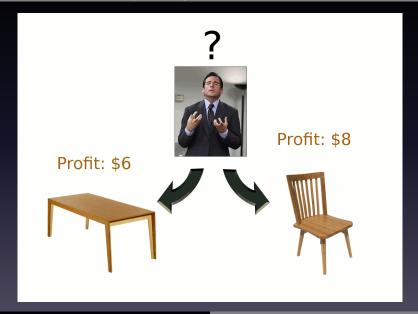
- I will use Excel Solver and AMPL
- You are allowed to use whatever language you prefer
- Alternatives are GAMS and Mosel
- Online option http://neos.mcs.anl.gov/neos/

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## Part II. Motivation and Example

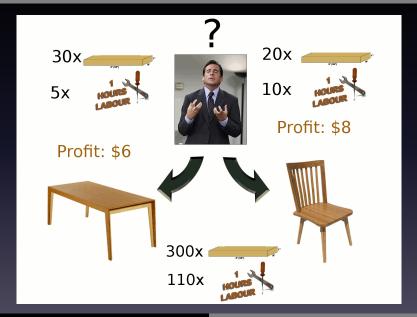
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## What would you produce?



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## And now?



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# Part III. Terminology and Formal Formulation

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#### Variables

- ullet  $x_1$  how many chairs we are going to produce
- ullet  $x_2$  how many tables we are going to produce

#### Objective function

One chair gives us profit \$8 and one table will gives us \$6. Our profit will be

$$6x_1 + 8x_2$$

#### Material constraint

for one chair we need 20 and for one table we need 30 pieces of wood and our budget is 300 pieces of wood

$$20x_1 + 30x_2 \le 300$$

#### Labour constraint

for one chair we need 10 and for one table we need 5 hours of work. Budget is 110 hours of work

$$10x_1 + 5x_2 \le 110$$

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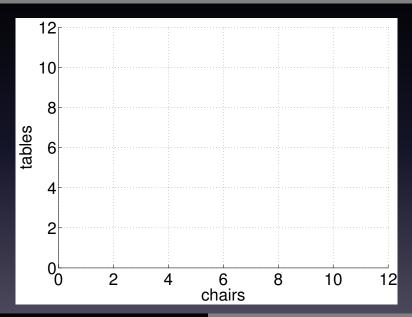
## Final optimization formulation

#### Optimization Problem

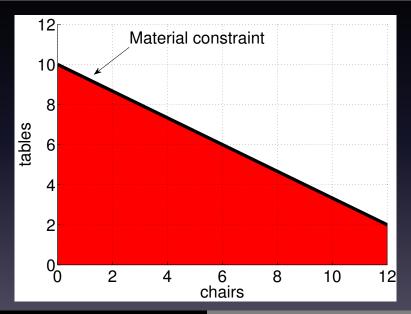
$$\begin{array}{lll} \text{maximize} & 6 \ x_1 + \ 8x_2 \\ \text{subject to} & 20x_1 + 30x_2 \leq 300 \\ & 10x_1 + \ 5x_2 \leq 110 \\ & x_1 & \geq 0 \\ & x_2 & \geq 0 \end{array}$$

- Objective function is linear (convex)
- All constraints are linear (convex)
- ⇒ this optimization problem is linear (Linear Program)

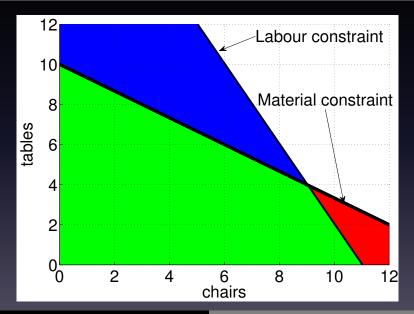
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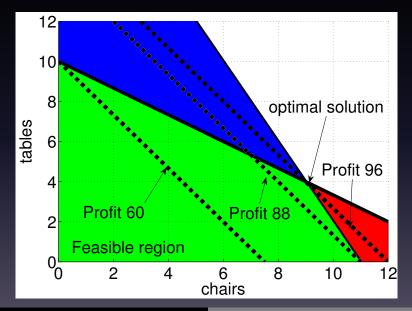
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# Part IV. General Optimization Problem, Convexity

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## Consider the vector $x \in \mathbf{R}^n$ of optimization variables Optimization Problem

$$\begin{array}{ll} \text{minimize} & f_0(x) \\ \text{subject to} & f_1(x) \leq b_1 \\ & f_2(x) \leq b_2 \\ & \vdots \\ & f_m(x) \leq b_m \end{array}$$

#### We denote by $\Omega$ feasible region:

$$\Omega = \{ x \in \mathbf{R}^n : f_1(x) \le b_1, \dots, f_m(x) \le b_m \}$$

#### Remember!

If all functions  $f_i(x)$  ( $i=0,1,\ldots,m$ ) are convex, then the optimization problem is (usually) easy to solve (by a computer).

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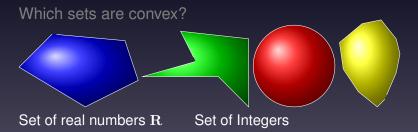
## Convex set

#### Definition

Set  $S \subset \mathbf{R}^n$  is convex, if

$$\forall x_1, x_2 \in S, \forall \lambda \in [0, 1] \Rightarrow (1 - \lambda)x_1 + \lambda x_2 \in S$$

(if you take any two points from S then the whole line segment has to be in S)

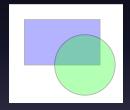


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## Set operation

#### Preserving convexity

Intersection of convex sets is convex set!



Adding a new constraint in optimization problem is actually intersection of original feasible set with a new set.

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## Convex function

#### Definition

Function  $f: \mathbf{R}^n \to \mathbf{R}$  is convex iff  $\forall x, y \in dom(f), \forall \lambda \in [0, 1]$ 

$$f((1 - \lambda)x + \lambda y) \le (1 - \lambda)f(x) + \lambda f(y)$$

(if you connect any two points on f then the whole line segment is above the function)

Convex vs. nonconvex





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## Operations preserving convexity

Multiplying by a positive constant

Let a > 0 and f be a convex function. Then  $a \cdot f$  is also convex

Summing functions

If functions  $\{f_i(x)\}_{i=1}^m$  are convex then also

$$\sum_{i=1}^{m} f_i(x)$$

is also convex

Linear function

A linear function  $f(x) = a_1x_1 + \cdots + a_nx_n$  is convex for any  $a_i \in \mathbf{R}$ 

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# Part V. Solving of an Optimization Problem in Excel

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#### **Variables**

x1 9 number of chairs produced x2 4 number of tables produced

#### **Optimization problem**

#### objective function

6 \* x1 + 8 \* x2 = 86

#### constraints

20 \* x1 + 30 \* x2 = 300 <= 300 Material constraint 10 \* x1 + 5 \* x2 = 110 <= 110 Labour constraint

x1 = 9 >= 0 Non-negative constraint x2 = 4 >= 0 Non-negative constraint

## The diet model

#### Task

Find the cheapest diet when restricted to the following food options?

food	potato	eggs	milk	chicken
cost (cents per 100g)	15	30	17	92

Nutritions and the daily requirement

		Yield (p	Daily requirement		
	potato	eggs	milk	chicken	
Energy (kcal)	390	210	60	198	2000
Protein (g)	13	19	3	18	56
Sugar (g)	60	5	10	0	17

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## Final optimization formulation

#### Variables:

 $x_1$  - amount of potato,  $x_2$  - amount of eggs,  $x_3$  - amount of milk and  $x_4$  - amount of chicken

**Optimization Problem** 

minimize 15 
$$x_1+$$
  $30x_2+17x_3+$   $92x_4$  subject to  $390x_1+210x_2+60x_3+198x_4 \geq 2000$  13  $x_1+$   $19x_2+3$   $x_3+$   $18x_4 \geq 56$  60  $x_1+$   $5x_2+10x_3+$   $0x_4 \geq 17$   $x_1$   $\geq 0$   $x_2$   $\geq 0$   $x_3$   $\geq 0$   $x_4 \geq 0$ 

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Varia	bles					
x1	5.1282051282 amount of potato					
x2	C	amo	ount of egg	gs		
x3	C	amo	ount of mil	k		
x4	<b>0</b> amount of chicken					
Optin	nization problem					
obied	ctive function					
	15 x1+30 x2+17 x3+92 x4	=	76.9231			
cons	traints					
	390 x1+210 x2+60 x3+ 198 x4	=	2000	>=	2000	Energy
	13 x1+19 x2+3 x3+18 x4	=	66.6667	>=	56	Protein
	60 x1+5 x2+10 x3+0 x4	=	307.692	>=	17	Sugar
	x1	=	5.12821	>=	0	Non-negative constraint
	x2	=	0	>=	0	Non-negative constraint
	x3	=	0	>=	0	Non-negative constraint
	x4	=	0	>=	0	Non-negative constraint

#### Post optimization modification

We do not want to get Diabetes, let us add limit on sugar!

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#### **Variables**

1.0328638498 amount of potato
7.6056338028 amount of eggs
<b>0</b> amount of milk
<b>0</b> amount of chicken

#### Optimization problem

#### objective function

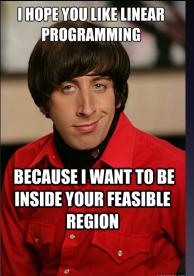
15 x1+30 x2+17 x3+92 x4 243.662

ons	traints				
	390 x1+210 x2+60 x3+ 198 x4	=	2000 >=	= 2000	Energy
	13 x1+19 x2+3 x3+18 x4	=	157.934 >=	= 56	Protein
	60 x1+5 x2+10 x3+0 x4	=	100 <mark>&gt;=</mark>	= 17	Sugar
	x1	=	1.03286 >=	= 0	Non-negative constraint
	x2	=	7.60563 >=	= 0	Non-negative constraint
	x3	=	0 >=	= 0	Non-negative constraint
	x4	=	0 >=	= 0	Non-negative constraint
	60 x1+5 x2+10 x3+0 x4	=	100 <=	= 100	Sugar

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## Attention!

There is a homework due on 9th of September at 9.20am!



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