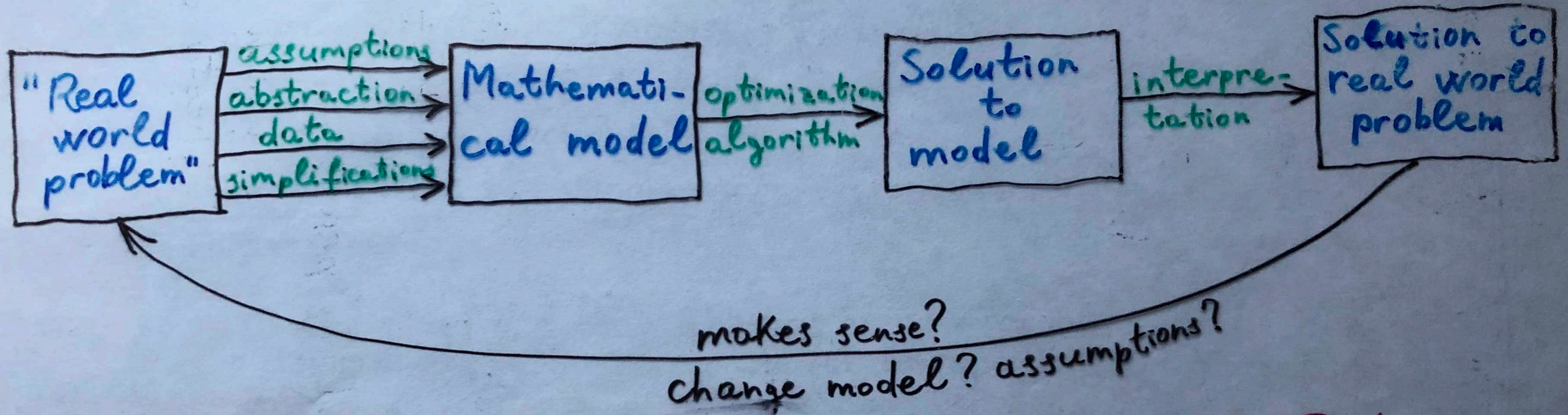


# A (schematic) view of the modeling/optimization process



applied math engineers

math CS

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In this class:

- special case of mathematical model
- some simple modeling
- use modeling language (optional)
- learn solution process (algorithm)

# Mathematical models in optimization

in general, look like the following:

$$\begin{array}{llll} \text{min or max} & f(x) & \leftarrow & \text{"objective function"} \\ \text{subject to} & a(x) \geq 0 & \leftarrow & \text{"functional constraints"} \\ & x \in S & \leftarrow & \text{"set constraints"} \\ & & \uparrow & \text{some set} \end{array}$$

$$f: \mathbb{R}^n \rightarrow \mathbb{R}, \quad a: \mathbb{R}^n \rightarrow \mathbb{R}^m, \quad S \subseteq \mathbb{R}^n$$

$x$  is called the decision variable.

▼ In words,

goal is to find a vector  $x$  that

- satisfies the constraints ( $a(x) \geq 0, x \in S$ )
- achieves max (min) objective function value.

▼ In the general form, very hard to solve.

▼ In this class a special case that

- is widely used in practice
- there is an algorithm which will find an "optimal" (best) solution.

# Classification of Mathematical Programming Problems

Stochastic vs Deterministic  
(have probabilistic information on data) (assume data is certain, no uncertainty)

integer, discrete  
( $S = \mathbb{N}^n$   
or  $S = \{0,1\}^n$ )

continuous  
( $f, a$  are differentiable functions,  $S = \mathbb{R}^n$ )

linear  
( $f, a$  are linear)

nonlinear  
( $f, a$  nonlinear)

# A simple first example

## Furniture manufacturer

- production of 1 table requires 5 ft pine, 2 ft oak, 3 hrs labor
- 1 chair 1 " " , 3 " " , 2 " "
- 1 desk 9 " " , 4 " " , 5 " "
- 1 bookcase 12 " " , 1 " " , 10 " "
- for 1 week have
  - ▼ 1500 ft pine
  - ▼ 1000 ft oak
  - ▼ 20 employees who will each work 40 hrs
- market data:

	profit	demand
table	\$12/unit	40
chair	\$5/unit	130
desk	\$15/unit	30
bookcase	\$10/unit	-

Goal: find production schedule for 1 week that will maximize profit.

Production schedule = # tables to be produced  $\rightarrow X_T$   
# chairs  $\rightarrow X_C$   
# desks  $\rightarrow X_D$   
# bookcases  $\rightarrow X_B$

ALWAYS DEFINE VARIABLES PROPERLY!

Incorporate all information into

mathematical model:

- Objective: maximize profit:

$$\max 12 \cdot X_T + 5 \cdot X_C + 15 \cdot X_P + 10 \cdot X_B \quad \left. \vphantom{\max} \right\} \text{objective function}$$

- Constraints/requirements:

$$\begin{aligned} \text{pine:} & \quad 5 \cdot X_T + 1 \cdot X_C + 9 \cdot X_P + 12 \cdot X_B \leq 1500 \\ \text{oak:} & \quad 2 \cdot X_T + 3 \cdot X_C + 4 \cdot X_P + 1 \cdot X_B \leq 1000 \\ \text{labor:} & \quad 3 \cdot X_T + 2 \cdot X_C + 5 \cdot X_D + 10 \cdot X_B \leq 800 \end{aligned} \quad \left. \vphantom{\begin{aligned}} \right\} \text{can't exceed available resources}$$

$$\begin{aligned} X_C & \geq 130 \\ X_T & \geq 40 \\ X_D & \geq 30 \\ X_B & \geq 0 \end{aligned} \quad \left. \vphantom{\begin{aligned}} \right\} \text{want to satisfy demand}$$

This is a special kind of optimization problem: the objective functions and the constraints are linear in  $X$ .

This MP is called a

Linear Programming Problem (LP)

# General form of LPs

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$$\begin{aligned} \text{max/min} \quad & C_1 X_1 + C_2 X_2 + \dots + C_n X_n \\ \text{subject to} \quad & A_{11} X_1 + A_{12} X_2 + \dots + A_{1n} X_n \leq b_1 \\ & A_{21} X_1 + A_{22} X_2 + \dots + A_{2n} X_n \leq b_2 \\ & \vdots \\ & A_{m1} X_1 + A_{m2} X_2 + \dots + A_{mn} X_n \leq b_m \\ & X_1 \geq 0, X_2 \geq 0, \dots, X_n \geq 0 \\ & x \in \mathbb{R}^n \end{aligned}$$

This is the standard form of LP.

Can also have equality or  $\geq$  constraints.

## Assumptions of LP

- proportionality (no discounts,  $C_i X_i^2$  not allowed)
  - additivity ( $X_i X_j$  not allowed)
  - divisibility (fractional values allowed)
  - certainty (of demand, etc.) etc.
- } linearity

(read more in H&L 3.3)

# Other ways of writing LPs

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$$1) \quad \max \sum_{i=1}^n c_i x_i$$
$$\text{s.t.} \quad \sum_{i=1}^n a_{ki} x_i \leq b_k \quad \forall k \in 1..m$$
$$x_i \geq 0 \quad \forall i \in 1..n$$

This summation form is used in AMPL.

## 2) matrix form

$$c = \begin{pmatrix} c_1 \\ c_2 \\ \vdots \\ c_n \end{pmatrix}, \quad \bar{x} = \begin{pmatrix} x_1 \\ \vdots \\ x_n \end{pmatrix}, \quad A = \begin{pmatrix} a_{11} & a_{12} & \dots & a_{1n} \\ a_{21} & a_{22} & \dots & a_{2n} \\ \vdots & \vdots & \dots & \vdots \\ a_{m1} & \dots & \dots & a_{mn} \end{pmatrix}, \quad b = \begin{pmatrix} b_1 \\ \vdots \\ b_m \end{pmatrix}$$

$$\max \quad c^T x$$
$$\text{s.t.} \quad Ax \leq b$$
$$x \geq 0$$

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Input in LP is  $(A, b, c)$   $\rightarrow$  given data, parameters  
Output  $\rightarrow$  is  $x$   $\rightarrow$  variables

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- **Programming = Planning** in this context, origins go back to military logistics in WWII (1940s)
- In a survey of Fortune 500 firms, **85%** of those responding said that they had used LP

# LP applications

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- production planning (inventory models, ...)
- finance (portfolio management, ...)
- scheduling (airline, production, ...)
- networks (transportation, telecommunications, ...)
- ...

## Goals in this class

- practise modelling process: given "real world problem", formulate as a MP problem (here mostly LP); become aware of underlying assumptions & limitations
- learn a general algorithm (solution procedure) for LP problems (Known as the "Simplex method")
- learn to view LP & the algorithm from different perspectives: geometry, algebra
- perform sensitivity analysis:
  - what if data changes?
  - how much will solution change, if at all?
- look into applications & special cases of LP
- learn to justify answers in a mathematically precise way
- introduction to nonlinear programming