

# Algorithms

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Linear programming:  
introduction


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# Recap

- Last HW: due Wed.
- Final: Monday of exam week at 8am

Review Friday before:

Have your finals schedule by this Friday.

- Final topic: linear programming  
Review worksheet  
one question will be on final

# NP-Completeness Recap

- Most useful:

List of problems: YES!

How to select a problem

# Linear program

In a linear program, we are given a set of variables

The goal is to give these real values so that:

① We satisfy some set of linear equations or inequalities

② We maximize or minimize some linear objective function

↳ often, "profit"

An example: Maximize profit

A chocolate shop produces  
2 products

$x_1$  - Type 1, worth \$1 each

$x_2$  - Type 2, worth \$6 each

Constraints:

eqn 1 - Can only produce  
200 of type 1 per day

2 - And at most 300 of  
type 2

3 - Total output per day  
of both is  $\leq 400$

LP: maximize  $1 \cdot x_1 + 6 \cdot x_2$

eqn 1:  $x_1 \leq 200$

2:  $x_2 \leq 300$

3:  $x_1 + x_2 \leq 400$

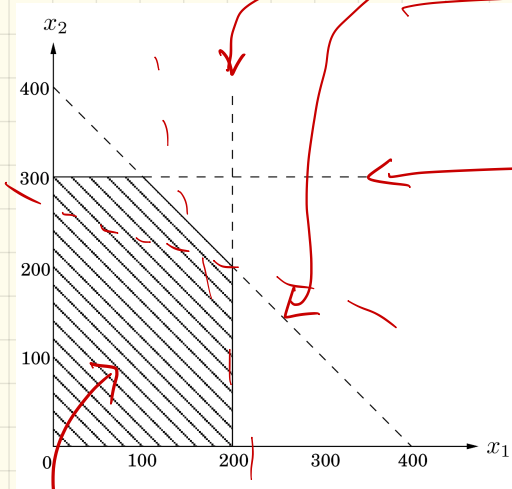
LP:

maximize  $7x_1 + 6x_2$   
line

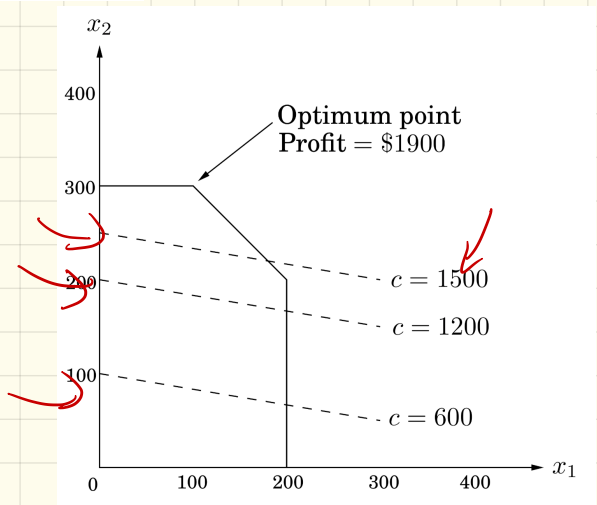
eqn 1:  $x_1 \leq 200$

$x_2 \leq 300$

$x_1 + x_2 \leq 400$



feasible  
soln



These go up in dimension  
with more  $x_i$ 's: ↙ new chocolate!

Maximize  $x_1 + 6x_2 + 13x_3$   
s.t.

$$x_1 \leq 200 \quad \textcircled{1}$$

$$x_2 \leq 300 \quad \textcircled{2}$$

$$x_1 + x_2 + x_3 \leq 400$$

$$x_2 + 3x_3 \leq 600$$

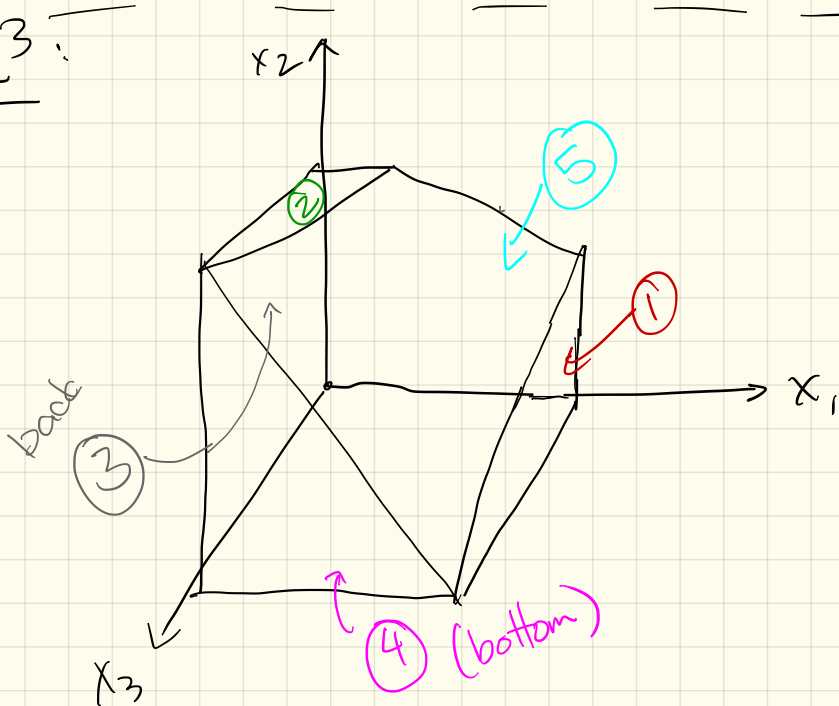
and

$$x_1 \geq 0 \quad \textcircled{3}$$

$$x_2 \geq 0 \quad \textcircled{4}$$

$$x_3 \geq 0 \quad \textcircled{5}$$

1123:



## Another (more general)

$n$  foods,  $m$  nutrients

$A_{ij}$  Let  $a_{i,j}$  = amount of nutrient  $i$  in food  $j$

vector  $\vec{r}$ :  $r_i$  = requirement of nutrient  $i$

$\vec{x}$ :  $x_j$  = amount of food  $j$  purchased

$\vec{c}$ :  $c_j$  = cost of food  $j$

Goal: Buy food so you satisfy nutrients while minimizing cost

1



The LP

min

$$\underbrace{\sum_j C_j X_j}_{\text{my cost}}$$

s.t.  $a_{1,1} X_1 + a_{1,2} X_2 + \dots + a_{1,n} X_n \geq r_1$

$$a_{2,1} X_1 + a_{2,2} X_2 + \dots + a_{2,n} X_n \geq r_2$$

$$\vdots \geq r_3$$

$$\vdots \geq r_m$$

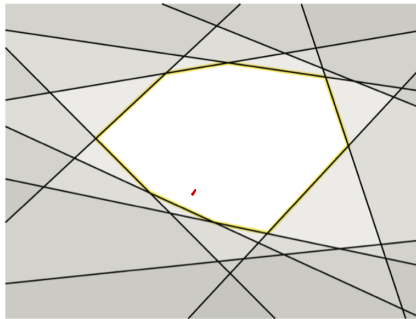
minimize  $\vec{C} \cdot \vec{X}^T$

s.t.  $A \vec{X} \leq \vec{r}$

In general, get systems like this:

$$\begin{aligned} & \text{maximize } \sum_{j=1}^d c_j x_j \\ & \text{subject to } \sum_{j=1}^d a_{ij} x_j \leq b_i \quad \text{for each } i = 1 \dots p \\ & \quad \quad \quad \sum_{j=1}^d a_{ij} x_j = b_i \quad \text{for each } i = p+1 \dots p+q \\ & \quad \quad \quad \sum_{j=1}^d a_{ij} x_j \geq b_i \quad \text{for each } i = p+q+1 \dots n \end{aligned}$$

Geometric picture:



A two-dimensional polyhedron (white) defined by 10 linear inequalities.

Canonical form:

Avoid having both  $\leq$   
and  $\geq$ .

So get something more  
like our first example:

$$\text{maximize } \sum_{j=1}^d c_j x_j$$

$$\text{subject to } \sum_{j=1}^d a_{ij} x_j \leq b_i \quad \text{for each } i = 1..n$$

$$x_j \geq 0 \quad \text{for each } j = 1..d$$

Or, given a vector  $\vec{c}$  & matrix  $A$ :

$$\max \vec{c} \vec{x}^T$$

$$A \vec{x} \leq \vec{b}$$

Anything can be put into canonical form:

① Avoid  $=:$   $\sum_{i=1}^d a_{ij} x_i = b_j$  eqn  $j$

change: 2 eqns:

$$\sum_{i=1}^d a_{ij} x_i \leq b_j$$

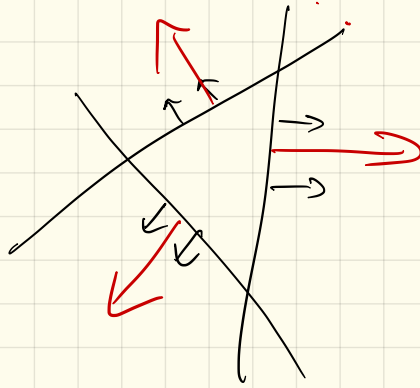
$$\sum_{i=1}^d a_{ij} x_i \geq b_j$$

② Avoid  $\geq$  :

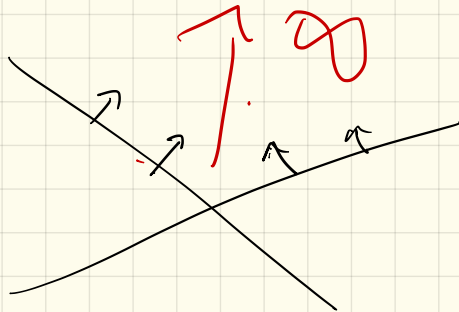
turn it into -

How could these not have a solution?

2 ways:

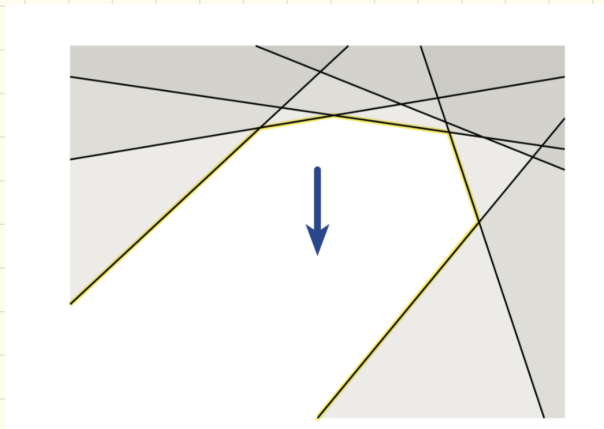
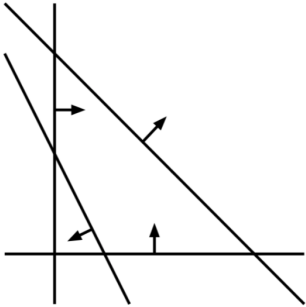


or



Better pictures (still 2d):

maximize  $x - y$   
subject to  $2x + y \leq 1$   
 $x + y \geq 2$   
 $x, y \geq 0$



Note:

① Multiplying by  $-1$  turns any maximization problem into a minimization one:

② Can turn inequalities into equalities via slack variables:

$$\sum_{i=0}^n a_i x_i \leq b$$



(3) Can change equalities into inequalities, also!

$$\sum_{i=1}^n a_i x_i = b$$





Solving LP's:

The simplex algorithm