

- Write on board:

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Rhodes 257

OH: T 10:30 - 12:30, Th 12:30 - 2:30

- Ask students to fill out bio sheets.
- Go over syllabus.

- In optimization 1, we learn about Linear Programming and an algorithm for solving them, the simplex method.
- Let us briefly recall what an LP problem looks like.

on slides

Ex: CTB sells bagels and cupcakes.

Ingredients:	1 doz Bagel	1 doz Cupcake	Daily Amount Available
Eggs	3	6	50
Flour	7	5	100
Butter	3	4	75

CTB has some regulars who come for bagels, so must have at least 3 dozens bagels.

Bagel's profits: \$6 per dozen,
cupcake's profits: \$8 per dozen.

How many dozens of bagels and cupcakes should CTB produce each day to maximize total profit?

Formulate as LP:

- ① Decision variables : x_1 = number of dozens of bagels
 x_2 = number of dozens of cupcakes
- ② Objective function : A linear function in terms of dec. vars which we minimize or maximize:
Total profit = $6x_1 + 8x_2$.

③ Constraints : Linear equalities or inequalities in terms of the dec. var.

$$3x_1 + 6x_2 \leq 50$$

$$7x_1 + 5x_2 \leq 100$$

$$3x_1 + 4x_2 \leq 75$$

$$x_1 \geq 3$$

$$x_1, x_2 \geq 0.$$

So, the LP:

$$\text{Max } 6x_1 + 8x_2$$

$$\text{s.t. } 3x_1 + 6x_2 \leq 50$$

$$7x_1 + 5x_2 \leq 100$$

$$3x_1 + 4x_2 \leq 75$$

$$x_1 \geq 3$$

$$x_1, x_2 \geq 0$$

Can add slack variables so that the constraints are equality constraints:

$$\text{Max } 6x_1 + 8x_2.$$

$$\text{s.t. } 3x_1 + 6x_2 + s_1 = 50$$

$$7x_1 + 5x_2 + s_2 = 100$$

$$3x_1 + 4x_2 + s_3 = 75$$

$$x_1 - s_4 = 3$$

$$x_1, x_2, s_1, s_2, s_3, s_4 \geq 0.$$

So in general, LP's look like:

$$(\text{Min or}) \text{ Max } c^T x$$

$$\text{s.t. } Ax = b$$

$$x \geq 0.$$

$$\text{In this example, } c = \begin{pmatrix} 6 \\ 8 \end{pmatrix}, A = \begin{pmatrix} 3 & 6 & 1 & 0 & 0 & 0 \\ 7 & 5 & 0 & 1 & 0 & 0 \\ 3 & 4 & 0 & 0 & 1 & 0 \\ 1 & 0 & 0 & 0 & 0 & -1 \end{pmatrix}, b = \begin{pmatrix} 50 \\ 100 \\ 75 \\ 3 \end{pmatrix}$$

$$x = \begin{pmatrix} x_1 \\ x_2 \\ x_3 \\ \vdots \\ x_6 \end{pmatrix}.$$

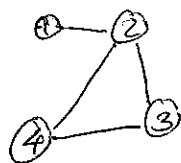
- The vectors and matrix: C, A, b are inputs to our linear program.
- The simplex method is an algorithm which allows us to find an optimal solution to a linear program.
- While the focus of Opt 1 is on linear programming, what we'll do this semester in Opt 2 is ~~a set~~
 - A survey of a selection of other areas and methods ~~off~~ in optimization.
 - The 4 topics are chosen because of their importance both in practice / industry / application as well as in the theory of opt'n.
 - Moreover! Although we can think of them as 4 "different" topics, it is actually more useful (for learning) and is just cooler to recognize various connections among them, and between them and LP ideas.
- Our first topic, Network flows, is a great starting point:

Many problems can be modeled as a problem on a network, even when they don't seem to involve any graphs / networks.

Also, many network problems can be formulated as an LP.
- What do we mean by a network?

A network, or a graph is a collection of nodes ("vertices") and edges ("arcs") that connect pairs of nodes.

E.g.



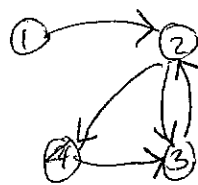
$N = \{1, 2, 3, 4\}$ set of nodes.

$E = \{\{1, 2\}, \{2, 3\}, \{2, 4\}, \{3, 4\}\}$ set of edges.

Graph $G = (N, E)$.

The example above is an undirected graph because the edges do not have a direction.

The following is a directed graph:



$$G = (N, E)$$

$$E = \{ (1, 2), (2, 3), (3, 2), (2, 4), (4, 3) \}$$

$$N = \{ 1, 2, 3, 4 \}$$

Note: the edge $(2, 3)$ is different from $(3, 2)$.

The first network optimization problem that we'll look at will be a problem on a directed graph (i.e. it takes a dir. graph as an input).

The minimum-cost network flow problem.

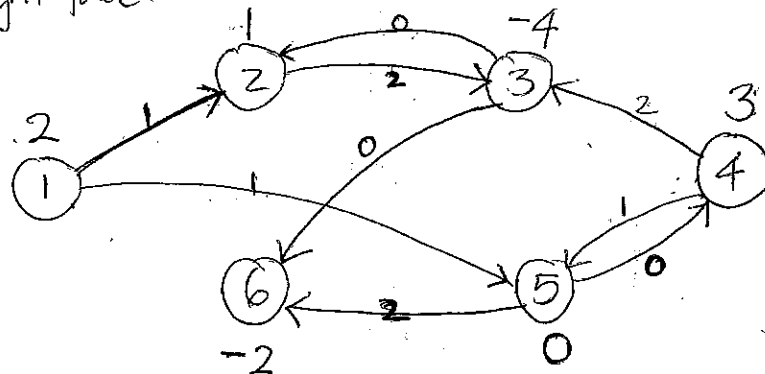
• I will first describe the problem "informally"

- Consider a problem that a company such as Amazon.com might face:

Ex.

6 nodes
9 edges.

Total cost = \$8.



On each edge:

cost per unit = \$1

Capacity = 2 units

- The company owns several warehouses that have a supply of ^{the}AMPL books.
- They also have data on customers who ordered the books from various college towns.
- The directed graph above represents this data, as well as the available shipping routes / connections.

Nodes = locations

Edges = available shipping connections.

We specify a "supply value" on each node.

(positive = supply node,
negative = demand node,
zero = transit node.)

Also have data:

cost per unit of shipment along each edge
capacity on each edge.

Problem: minimizing total shipping cost
while satisfying all demands, and the capacity constraints

Example solution: see graph (highlighted)

Note: In our example, total supply = $3+2+1=6$.
total demand = $+2 + +4 = 6$.

so, we ~~can~~ ^{might be able to} satisfy all demand

∴ For the problem to be solvable, it is necessary that
total supply \geq total demand.

But for our min-cost flow model, we'll make
a stronger assumption on our input data:

Assumption: total supply = total demand.

$$\therefore \sum \text{supply values} = 0.$$

So, here is the minimum-cost network flow problem ("model")
formally:

• Given the following inputs:

- ① A directed graph $G = (N, E)$
- ② Supply values $b_i \forall i \in N$
- ③ Edge costs (per unit) $c_{ij} \forall (i, j) \in E$
- ④ Edge capacity $u_{ij} \forall (i, j) \in E \geq 0$.

• Find an optimal "flow" (i.e. # units to be shipped on each edge)
that minimizes total cost while satisfying
capacity and supply constraints:

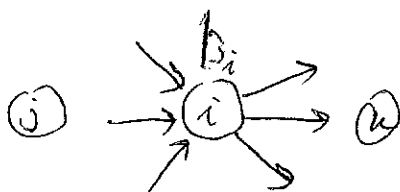
① Capacity constraints: on each edge $(i,j) \in E$:

$$\# \text{ units shipped along edge } (i,j) \leq u_{ij}$$

② Supply constraints: on each node $i \in N$:

net flow out of node i = supply value at node i

$$\% \quad \text{flow out of } i - \text{flow into } i = b_i$$



Assumption: $\sum b_i = 0$.

This looks like a problem whose objective and constraints are linear in terms of the flow values.

Formulate as an LP:

① Dec. variables: for each $(i,j) \in E$: x_{ij} = # units shipped along edge (i,j)
= "flow value on edge (i,j) ."

E.g. $x = \begin{pmatrix} x_{12} \\ x_{23} \\ x_{32} \\ \vdots \end{pmatrix} \leftarrow \text{a vector}$

② Objective: Minimize total cost

$$\text{Total cost} = \sum_{(i,j) \in E} c_{ij} x_{ij}$$

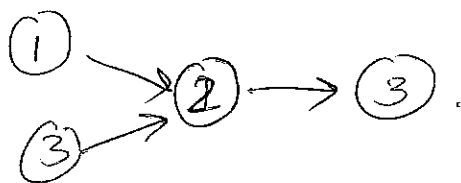
E.g.: $1 \cdot x_{12} + 1 \cdot x_{23} + \dots = \text{total cost}.$

③ Constraints

① Cap. constraints: $x_{ij} \leq u_{ij} \quad \forall (i,j) \in E.$

② Flow conservation constraints.

Eg: node 2:



$$\underbrace{x_{23}}_{\text{flow out of 2}} - \underbrace{(x_{12} + x_{32})}_{\text{flow into 2}} \text{ must equal } s_2 = 1.$$

$$\therefore x_{23} - (x_{12} + x_{32}) = 1.$$

(A couple more example : demand & transit nodes.)

\therefore In general:

$$\sum_{(i,j) \in E} x_{ij} - \sum_{(k,i) \in E} x_{ki} = b_i \quad \forall i \in N.$$

o.o LP formulation of min-cost network flow:

$$\begin{array}{ll}
 \text{Min} & \sum_{(i,j) \in E} c_{ij} x_{ij} \\
 \text{s.t.} & x_{ij} \leq u_{ij} \quad \forall (i,j) \in E \\
 & \sum_{(i,j) \in E} x_{ij} - \sum_{(k,i) \in E} x_{ki} = b_i \quad \forall i \in E \\
 & x_{ij} \geq 0.
 \end{array}$$

→ AMPL Demo.

Next class: Integrality theorem min-cost flow.