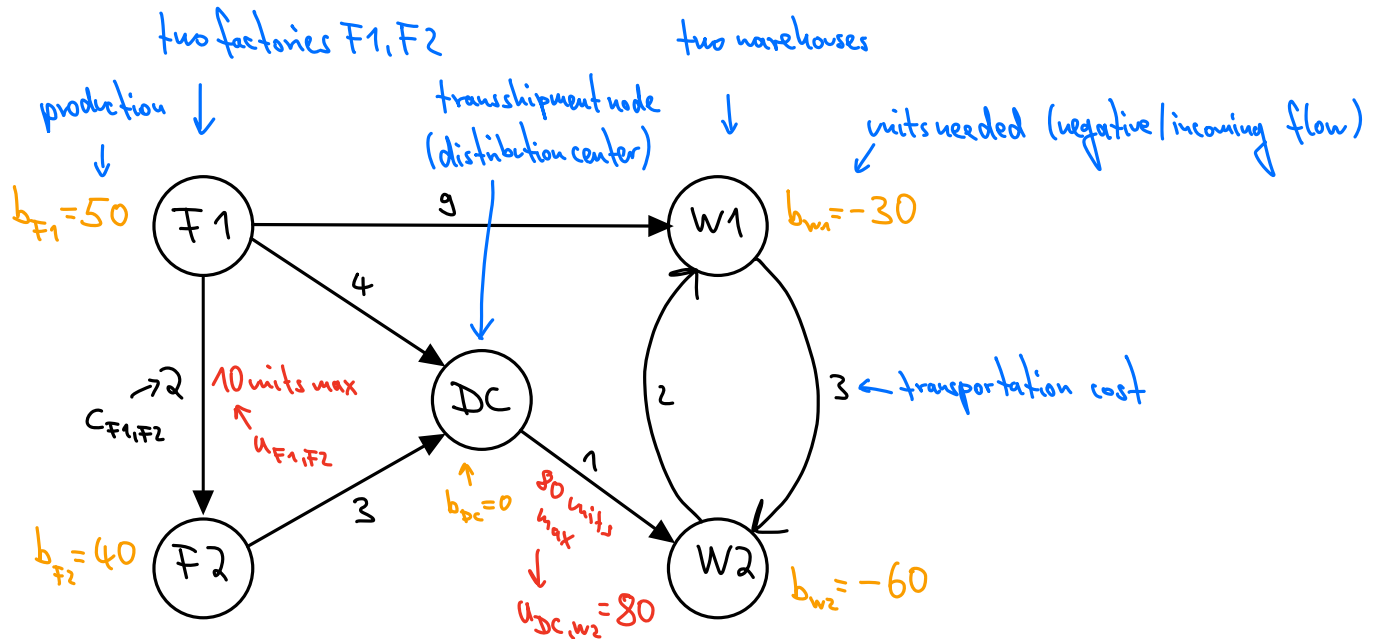


Last time we started discussing minimum cost flow problems.

Example (Hillier, Lieberman Chapters 3.4 and 9.6):



Set of nodes  $N = \{F1, F2, DC, W1, W2\}$

Set of arcs  $A = \{(F1, F2), (F1, DC), (F1, W1), (F2, DC), (DC, W2), (W1, W2), (W2, W1)\}$

General formulation: • nodes  $i \in N$

• directed arcs  $(i, j) \in A$

•  $c_{ij}$ : unit cost of transportation on arc  $(i, j)$

•  $u_{ij}$ : max. capacity on arc  $(i, j)$

• node constraints •  $b_i > 0$  for supply/source nodes

•  $b_i < 0$  for demand/sink nodes

•  $b_i = 0$  for transshipment nodes

•  $x_{ij}$ : flow from  $i$  to  $j$  (decision variables)

LP formulation: • Minimize cost  $Z = \sum_{(i,j) \in A} c_{ij} x_{ij}$

• Constraints:  $\underbrace{\sum_j x_{ij}}_{\text{outgoing flow at node } i} - \underbrace{\sum_j x_{ji}}_{\text{incoming flow at node } i} = b_i$  for all nodes  $i \in N$

and  $0 \leq x_{ij} \leq u_{ij}$  for all arcs  $(i,j) \in A$ .

Note: Similarly as discussed before:

- One can show that a necessary condition for feasible solutions is  $\sum_i b_i = 0$  (supply = demand). This can always be achieved by introducing dummy nodes (similarly as we discussed before).
- All basic variables in all basic feasible solutions are integer, if all  $b_i$  and  $u_{ij}$  are integer.
- A faster network simplex method is available.

How can our previous cases be formulated as min. cost flow problems?

- Transportation problem: - only supply and demand nodes (no transshipment nodes), all supply nodes connected to all demand nodes
  - all  $u_{ij} = \infty$  since no upper bound constraints
- Shortest Path problem: - origin = supply node with  $b_o = 1$ 
  - destination = demand node with  $b_t = -1$
  - other nodes are transshipment, i.e.,  $b_i = 0$ .
  - draw all arcs in both directions (except source/sink)
  - all  $u_{ij} = \infty$
  - $c_{ij} = \text{distances as given}$

- Max Flow problem: - all  $c_{ij} = 0$  (larger than a good guess for the max. flow given the  $u_{ij}$ )
  - source  $b_s = F$  large, sink  $b_t = -F$ , all other nodes  $b_i = 0$
  - $u_{ij}$  as given
  - extra arc from source to sink with  $c_{st} = M$  very large (and  $u_{st} = \infty$ )  
↳ then  $c_{ij} = 0$  arcs are preferred, rest is sent through  $c_{st}$  arc at high cost

## Another example: Project Management (extra material)

### Problem type 1:

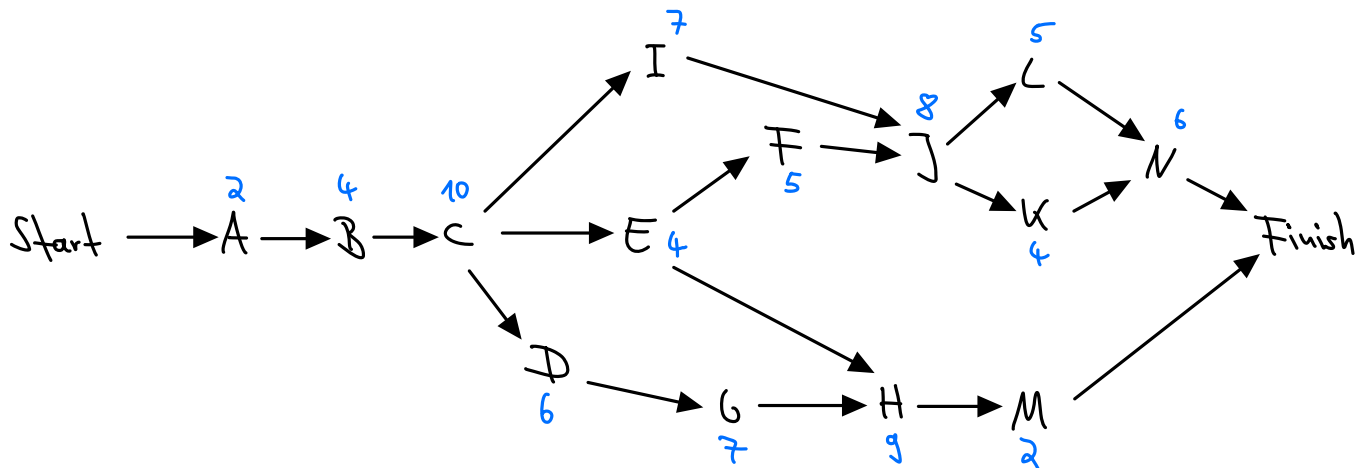
- Given: set of activities taking time  $T_i$  to complete, and their dependencies (e.g., building construction)
- Goal: find minimal time to completion, and the corresponding order of activities (= critical path through network)
- Set up: - decision variables  $t_i =$  starting time of activity  $i$ 
  - minimize  $t_{\text{finish}}$
  - constraints:  $t_j \geq t_i + T_i$  if  $j$  depends on  $i$
  - $t_{\text{start}} = 0, t_i \geq 0$

### Problem type 2:

- Suppose a completion time is prescribed, but it is shorter than the critical path from above. Assume we can reduce the times of certain activities at a cost (this is called "crashing" an activity).
- Introduce  $x_i =$  units of time saved on activity  $i$  (decision variables)
  - $T_i =$  regular time for completion
  - $R_i =$  maximal time that can be saved
  - $c_i =$  cost of saving one unit of time

- LP problem: minimize cost  $\sum_i c_i x_i$   
 subject to  $x_i \leq R_i$  for all activities  $i$   
 $t_j \geq t_i + (T_i - x_i)$   
 $t_i \geq 0, x_i \geq 0$

Example (Hillier, Lieberman Chapter 9.8 (9th edition)): Reliable Construction Company



Critical path = longest path = A-B-C-E-F-J-L-N = 44 weeks  
 so all activities can be finished

Suppose project needs to be completed in 40 weeks, i.e., we need to crash some activities → see promo code discussion.

Some possible exam topics/questions:

- Formulate a given "text problem" as LP
- Solve LP problem graphically (also: shape of feasible region, number of solutions)
- Write LP problem in standard form
- Gaussian elimination and basic solutions
- Use simplex method to solve LP problem (what if feasible region is unbounded?)
- Shadow prices and their meaning
- Dual LP problems, weak and strong duality
- Transportation problems and their LP formulation
- Integer solution property, dummy variables
- Solve shortest path, minimum spanning tree, maximum flow problems
- Minimum cost flow problem and LP
- Pyomo: explain code; explain output; extract LP problem in mathematical notation from code; what happens if something is changed in the code

Good practice midterm: Fall 2020 (see website)