

# Graphs and Network Flows

## IE411

### Lecture 20

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## Network Simplex Algorithm

**Input:** A network  $G = (N, A)$ , a vector of capacities  $u \in \mathbb{Z}^A$ , a vector of costs  $c \in \mathbb{Z}^A$ , and a vector of supplies  $b \in \mathbb{Z}^N$

**Output:**  $x$  represents a minimum cost network flow

Determine an initial feasible tree structure  $(T, L, U)$

Let  $x$  be flow and  $\pi$  be node potentials associated with  $(T, L, U)$

**while** Some non-tree arc violates the optimality conditions **do**

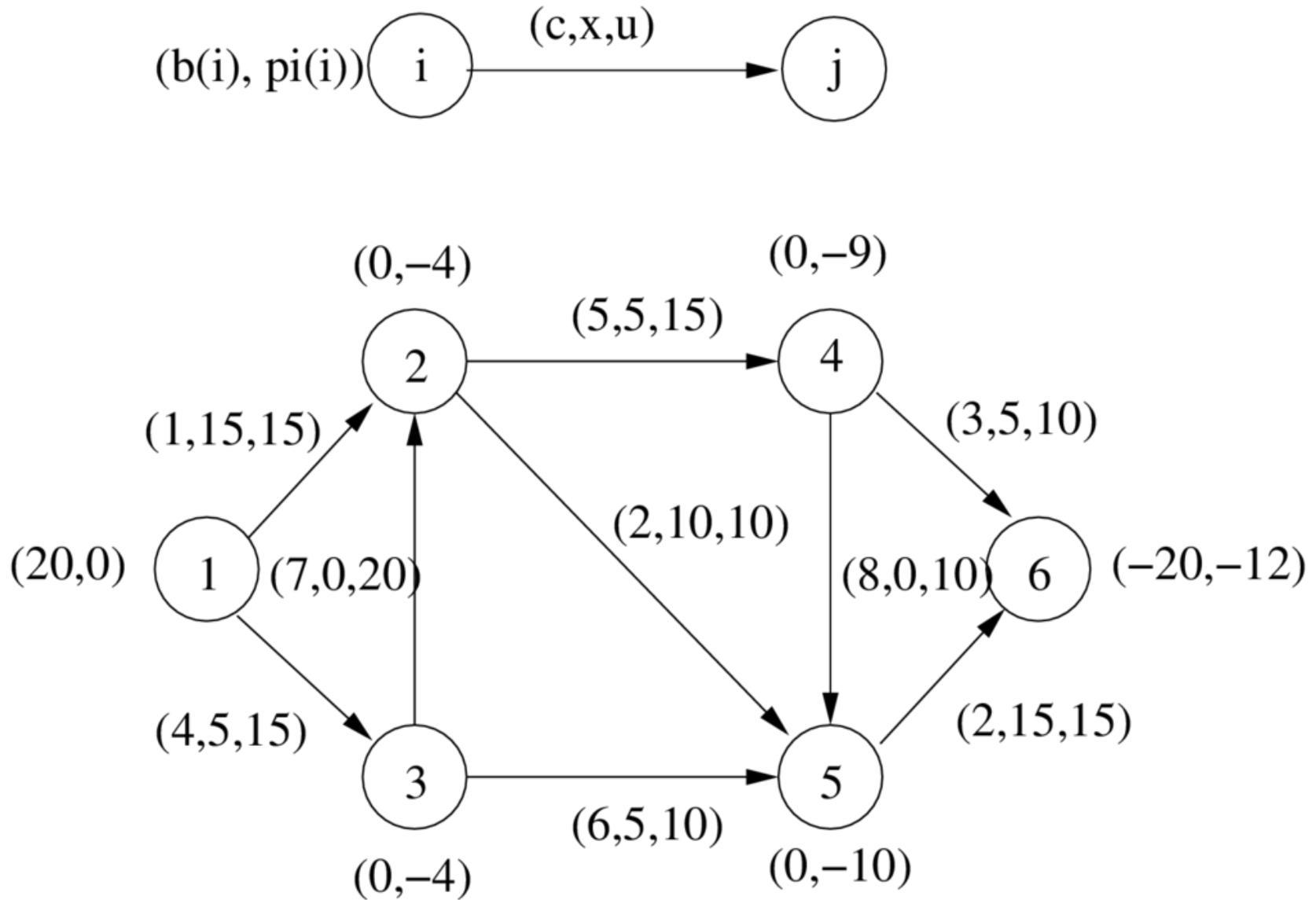
    Select an entering arc  $(k, l)$  violating optimality conditions

    Add arc  $(k, l)$  to tree and determine leaving arc  $(p, q)$

    Perform a tree update and update solutions  $x$  and  $\pi$

**end while**

## Example



## Degeneracy in Network Simplex

- Network simplex does not necessarily terminate in a finite number of iterations
- Poor choices of entering and leaving arcs lead to *cycling*
- Maintaining a *strongly feasible spanning tree* guarantees finite termination and speeds up the running time
- A pivot iteration is *non-degenerate* if  $\delta > 0$  and is *degenerate* if  $\delta = 0$
- A degenerate iteration occurs only if  $T$  is a degenerate spanning tree.
- If two arcs tie while determining the value of  $\delta$ , the next spanning tree will be degenerate.

## Strongly Feasible Spanning Trees

Let  $(T, L, U)$  be a spanning tree structure for a MCFP with integral data. A spanning tree  $T$  is *strongly feasible* if

- every tree arc with zero flow is upward pointing (toward root) and every tree arc with flow equal to capacity is downward pointing (away from root)
- we can send a positive amount of flow from any node to the root along the tree path without violating any flow bound.

These two definitions are equivalent. Proof?

## Modifications to Network Simplex Algorithm

- Initial Strongly Feasible Spanning Tree
  - Does our construction algorithm work?
    - \* A non-degenerate spanning tree is always strongly feasible.
    - \* A degenerate spanning tree is sometimes strongly feasible.
- Leaving Arc Rule
  - Select the leaving arc as the last blocking arc encountered in traversing the pivot cycle  $W$  along its orientation starting at the apex  $w$ .
  - Proof: Show that next spanning tree is strongly feasible.

## Termination

- Each non-degenerate pivot strictly decreases objective function, so number of non-degenerate pivots is finite.
- To show: The pivot rule maintains the invariant that each spanning tree solution is strongly feasible.
  - Consider  $W_2$ , the part of the cycle from  $p$  to apex: no arc can be blocking by pivot rule.
  - Consider  $W_1$ , the part of the cycle from apex to  $q$ :
    - \* If pivot is non-degenerate, then must be able to send flow backwards to root.
    - \* If pivot is degenerate, then  $(p, q)$  must be contained in the part of the cycle from apex to  $k$ . Since the previous tree was strongly feasible and flows don't change, we must still be able to send positive flow back along  $W_1$ .
- Note that each degenerate pivot must decrease the sum of the node potentials, so the number of degenerate pivots in between each successive non-degenerate pivot must also be finite.

## Network Simplex and Simplex for LP

- Network simplex is an implementation of the simplex method for general LPs with upper and lower bounds on the variables.
- Tree solutions correspond to basic solutions in the simplex method.
- To see this, recall from the homework that a directed graph is acyclic if and only if its arc-node incidence matrix is lower triangularizable.
- The number of linearly independent constraints in our formulation of the MCFP is  $n - 1$ .
- Any basis matrix thus consists of  $n - 1$  linearly independent columns.
- It is easy to show that such a basis matrix must have all 1's on the diagonal and must be a tree.

## Network Simplex and Simplex for LP (cont.)

- The node potentials are the dual values from the LP and reduced costs are the reduced costs of the arcs.
- Each iteration of network simplex corresponds to a pivot operation in general simplex.
  - Find a nonbasic (nontree) variable (arc) with negative reduced cost fixed at its lower or positive reduced cost fixed at its upper bound.
  - Increase the value of this variable until one of the basic variables hits its bound.
  - Remove the blocking variable from the basis.
- Because of the special form of the problem, we do not need to maintain the basis inverse explicitly.

## Dual Network Simplex

- As in general simplex, there is a dual version of the algorithm.
- In this version, we maintain optimality conditions, while trying to achieve feasibility.
- We start with a (possibly infeasible) solution that satisfies optimality conditions and choose a tree arc whose flow violates its bounds.
- This arc is the *leaving* arc.
- We want to push flow around some cycle until the arc reaches its bound.
- The *entering arc* is the one with the “correct” orientation that has the smallest reduced cost (absolute value).
- There is a finite version of this algorithm that uses a perturbation technique similar to that used in general simplex.

## Polynomial Algorithms for MCFPs

- As with the maximum flow problem, we can use scaling to reduce the dependence of running time on  $U$  and  $C$ .
- By scaling the capacities, we can get a running time of  $O(m \log US(n, m, nC))$ .
- By scaling the costs, we can get a running time of  $O(n^2 m \log(nC))$ .
- By scaling both, we get a running time of  $O(nm \log U \log nC)$ .
- The minimum mean cycle-canceling algorithm has a strongly polynomial running time of  $O(n^2 m^3 \log n)$  (or  $O(n^2 n^2 \log n C)$ ).

## Sensitivity Analysis

- Determine changes in optimal solution resulting from changes in data
  - arc cost
  - supply/demand
  - arc capacity
- Assuming spanning tree structure remains unchanged, if change in data affects
  - optimality → perform primal pivots to achieve optimality
  - feasibility → perform dual pivots to achieve feasibility

## Cost Sensitivity Analysis

Suppose the cost of arc  $(p, q)$  increases by  $\lambda$  units.

**Case 1**  $(p, q)$  is a non-tree arc

**Case 2**  $(p, q)$  is a tree arc

## Supply/Demand Sensitivity

- Suppose supply/demand  $b(k)$  of node  $k$  increases by  $\lambda$  units. Then, the supply/demand  $b(l)$  of some node  $l$  decreases by  $\lambda$  units.
- From the mass balance constraints, we know that we must ship  $\lambda$  units of flow from node  $k$  to node  $l$ .
- Let  $P$  be the unique tree path from node  $k$  to node  $l$ . And let  $\delta = \min\{\delta_{ij} : (i, j) \in P\}$ .
- If  $\lambda \leq \delta$ , then ...
- If  $\lambda > \delta$ , then ...

## Capacity Sensitivity Analysis

- Suppose capacity of  $(p, q)$  increases by  $\lambda$  units.
- What do we know about previous optimal solution?
- If  $(p, q)$  is a tree arc or a non-tree arc at its lower bound
- If  $(p, q)$  is a non-tree arc at its upper bound