

15.082J, 6.855J, and ESD.78J
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Eulerian Walks
Flow Decomposition and
Transformations

Eulerian Walks in Directed Graphs in $O(m)$ time.

Step 1. Create a breadth first search tree into node

1. For j not equal to 1, put the arc out of j in T last on the arc list $A(j)$.

Step 2. Create an Eulerian cycle by starting a walk at node 1 and selecting arcs in the order they appear on the arc lists.

Proof of Correctness

Relies on the following observation and invariant:

Observation: The walk will terminate at node 1.

Whenever the walk visits node j for $j \neq 1$, the walk has traversed one more arc entering node j than leaving node j .

Invariant: If the walk has not traversed the tree arc for node j , then there is a path from node j to node 1 consisting of nontraversed tree arcs.

**Eulerian Cycle
Animation**

Eulerian Cycles in undirected graphs

Strategy: reduce to the directed graph problem as follows:

Step 1. Use dfs to partition the arcs into disjoint cycles

Step 2. Orient each arc along its directed cycle.
Afterwards, for all i , the number of arcs entering node i is the same as the number of arcs leaving node i .

Step 3. Run the algorithm for finding Eulerian Cycles in directed graphs

Flow Decomposition and Transformations

- ◆ Flow Decomposition
- ◆ Removing Lower Bounds
- ◆ Removing Upper Bounds
- ◆ Node splitting

- ◆ **Arc flows:** an arc flow x is a vector x satisfying:

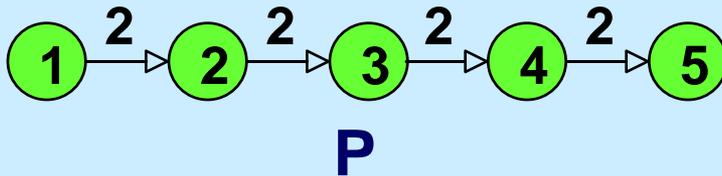
$$\text{Let } b(i) = \sum_j x_{ij} - \sum_i x_{ji}$$

We are not focused on upper and lower bounds on x for now.

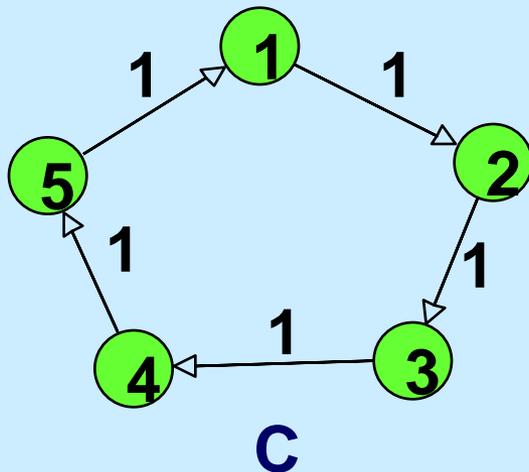
Flows along Paths

Usual: represent flows in terms of flows in arcs.

Alternative: represent a flow as the sum of flows in paths and cycles.



Two units of flow
in the path P

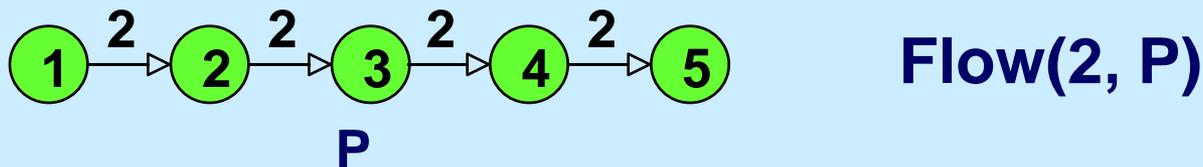


One unit of flow
around the cycle C

Properties of Path Flows

Let P be a directed path.

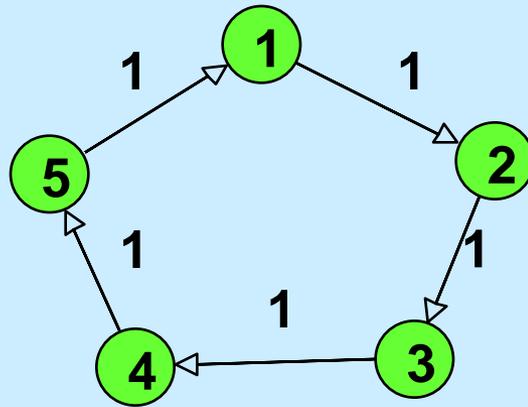
Let $\text{Flow}(\delta, P)$ be a flow of δ units in each arc of the path P .



Observation. If P is a path from s to t , then $\text{Flow}(\delta, P)$ sends units of δ flow from s to t , and has conservation of flow at other nodes.

Property of Cycle Flows

- ◆ If p is a cycle, then sending one unit of flow along p satisfies conservation of flow everywhere.



Representations as Flows along Paths and Cycles

Let \mathcal{P} be a collection of Paths; let $f(P)$ denote the flow in path P

Let \mathcal{C} be a collection of cycles; let $f(C)$ denote the flow in cycle C .

One can convert the path and cycle flows into an arc flow x as follows: for each arc $(i,j) \in A$

$$x_{ij} = \sum_{P \ni (i,j)} f(P) + \sum_{C \ni (i,j)} f(C)$$

Flow Decomposition

x: Initial flow

y: updated flow

G(y): subgraph with arcs (i, j) with $y_{ij} > 0$ and incident nodes

f(P) Flow around path P (during the algorithm)

P: paths with flow in the decomposition

C: cycles with flow in the decomposition

INVARIANT

$$x_{ij} = y_{ij} + \sum_{P \ni (i,j)} f(P) + \sum_{C \ni (i,j)} f(C)$$

Initially, $x = y$ and $f = 0$.

At end, $y = 0$, and f gives the flow decomposition.

Deficit and Excess Nodes

Let x be a flow (not necessarily feasible)

If the flow out of node i exceeds the flow into node i , then node i is a **deficit** node.

Its deficit is $\sum_j x_{ij} - \sum_k x_{ki}$.

If the flow out of node i is less than the flow into node i , then node i is an **excess** node.

Its excess is $-\sum_j x_{ij} + \sum_k x_{ki}$.

If the flow out of node i equals the flow into node i , then node i is a **balanced** node.

Flow Decomposition Algorithm

Step 0. Initialize: $y := x$; $f := 0$; $\mathcal{P} := \emptyset$; $C := \emptyset$;

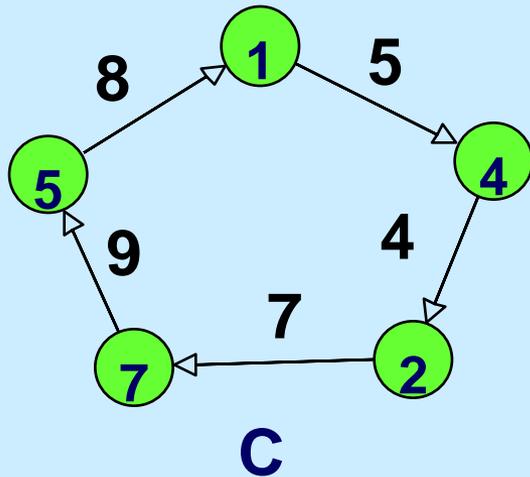
Step 1. Select a deficit node j in $G(y)$. If no deficit node exists, select a node j with an incident arc in $G(y)$;

Step 2. Carry out depth first search from j in $G(y)$ until finding a directed cycle W in $G(y)$ or a path W in $G(y)$ from s to a node t with excess in $G(y)$.

Step 3.

- 1. Let $\Delta =$ capacity of W in $G(y)$. (See next slide)**
- 2. Add W to the decomposition with $f(W) = \Delta$.**
- 3. Update y (subtract flow in W) and excesses and deficits**
- 4. If $y \neq 0$, then go to Step 1**

Capacities of Paths and Cycles

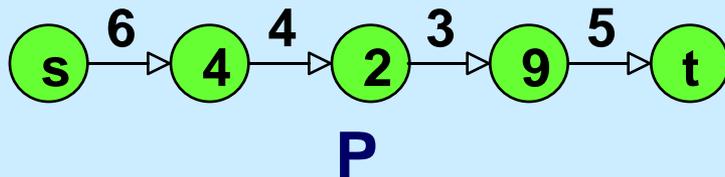


The capacity of C is
 $= \min$ arc flow on C
wrt flow y .

capacity = 4

deficit = 3

excess = 2



The capacity of P is
denoted as $\Delta(P, y) =$
 $\min[\text{def}(s), \text{excess}(t),$
 $\min (x_{ij} : (i,j) \in P)]$

χαπαχιτψ = 2

**Flow Decomposition
Animation**

Complexity Analysis

- ◆ ***Select initial node:***
 - $O(1)$ per path or cycle, assuming that we maintain a set of supply nodes and a set of balanced nodes incident to a positive flow arc
- ◆ ***Find cycle or path***
 - $O(n)$ per path or cycle since finding the next arc in depth first search takes $O(1)$ steps.
- ◆ ***Update step***
 - $O(n)$ per path or cycle

Complexity Analysis (continued)

Lemma. The number of paths and cycles found in the flow decomposition is at most $m + n - 1$.

Proof. In the update step for a cycle, at least one of the arcs has its capacity reduced to 0, and the arc is eliminated.

In an update step for a path, either an arc is eliminated, or a deficit node has its deficit reduced to 0, or an excess node has its excess reduced to 0.

(Also, there is never a situation with exactly one node whose excess or deficit is non-zero).

Conclusion

Flow Decomposition Theorem. Any non-negative feasible flow x can be decomposed into the following:

- i. the sum of flows in paths directed from deficit nodes to excess nodes, plus
- ii. the sum of flows around directed cycles.

It will always have at most $n + m$ paths and cycles.

Remark. The decomposition usually is not unique.

Corollary

A ***circulation*** is a flow with the property that the flow in is the flow out for each node.

Flow Decomposition Theorem for circulations. Any non-negative feasible flow x can be decomposed into the sum of flows around directed cycles.

It will always have at most m cycles.

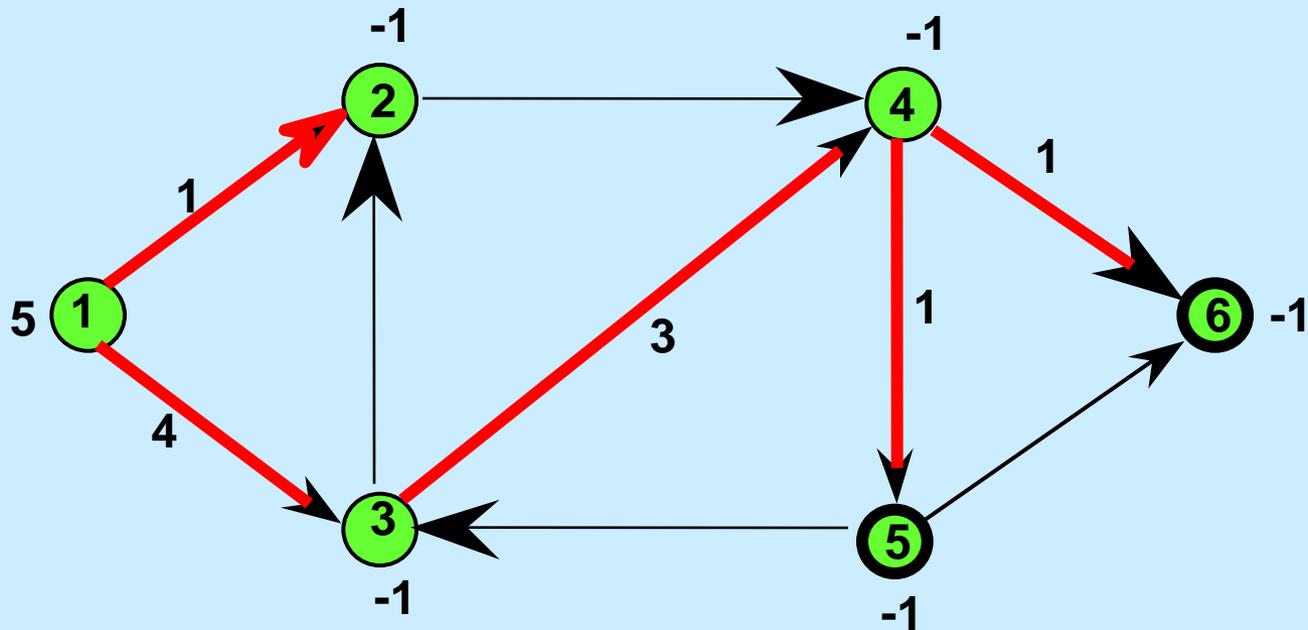
An application of Flow Decomposition

Consider a feasible flow where the supply of node 1 is $n-1$, and the supply of every other node is -1 .

$$\sum_j x_{ij} - \sum_j x_{ji} = \begin{cases} n-1 & \text{if } i=1 \\ -1 & \text{if } i \neq 1 \end{cases}$$

Suppose the arcs with positive flow have no cycle. Then the flow can be decomposed into unit flows along paths from node 1 to node j for each $j \neq 1$.

A flow and its decomposition



The decomposition of flows yields the paths:

1-2, 1-3, 1-3-4

1-3-4-5 and 1-3-4-6.

There are no cycles in the decomposition.

Application to shortest paths

To find a shortest path from node 1 to each other node in a network, find a minimum cost flow in which $b(1) = n-1$ and $b(j) = -1$ for $j \neq 1$.

The flow decomposition gives the shortest paths.

Other Applications of Flow Decomposition

- ◆ Reformulations of Problems.
 - There are network flow models that use path and cycle based formulations.
 - Multicommodity Flows
- ◆ Used in proving theorems
- ◆ Can be used in developing algorithms

The min cost flow problem (again)

The minimum cost flow problem

u_{ij} = capacity of arc (i,j) .

c_{ij} = unit cost of flow sent on (i,j) .

x_{ij} = amount shipped on arc (i,j)

Minimize $\sum c_{ij}x_{ij}$

$$\sum_j x_{ij} - \sum_k x_{ki} = b_i \quad \text{for all } i \in N.$$

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

The model seems very limiting

- The lower bounds are 0.
- The supply/demand constraints must be satisfied exactly
- There are no constraints on the flow entering or leaving a node.

We can model each of these constraints using transformations.

- In addition, we can transform a min cost flow problem into an equivalent problem with no upper bounds.

Eliminating Lower Bound on Arc Flows

Suppose that there is a lower bound l_{ij} on the arc flow in (i,j)

Minimize $\sum c_{ij}x_{ij}$

$$\sum_j x_{ij} - \sum_k x_{ki} = b_i \quad \text{for all } i \in N.$$

$$\text{and } l_{ij} \leq x_{ij} \leq u_{ij} \quad \text{for all } (i,j) \in A.$$

Then let $y_{ij} = x_{ij} - l_{ij}$. Then $x_{ij} = y_{ij} + l_{ij}$

Minimize $\sum c_{ij}(y_{ij} + l_{ij})$

$$\sum_j (y_{ij} + l_{ij}) - \sum_k (y_{ki} + l_{ki}) = b_i \quad \text{for all } i \in N.$$

$$\text{and } l_{ij} \leq (y_{ij} + l_{ij}) \leq u_{ij} \quad \text{for all } (i,j) \in A.$$

Then simplify the expressions.

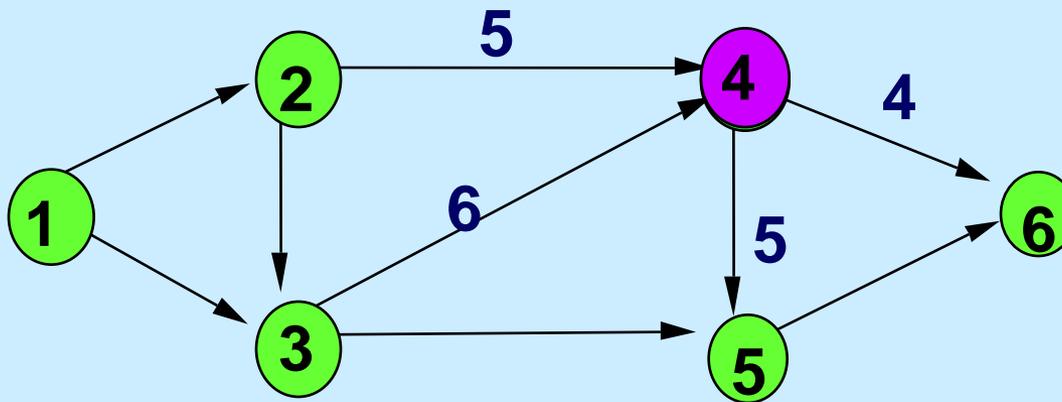
Allowing inequality constraints

$$\begin{aligned} \text{Minimize } & \sum c_{ij}x_{ij} \\ & \sum_j x_{ij} - \sum_k x_{ki} \leq b_i \quad \text{for all } i \in N. \\ & \text{and } l_{ij} \leq x_{ij} \leq u_{ij} \quad \text{for all } (i,j) \in A. \end{aligned}$$

Let $B = \sum_i b_i$. For feasibility, we need $B \geq 0$

Create a “dummy node” $n+1$, with $b_{n+1} = -B$. Add arcs $(i, n+1)$ for $i = 1$ to n , with $c_{i,n+1} = 0$. Any feasible solution for the original problem can be transformed into a feasible solution for the new problem by sending excess flow to node $n+1$.

Node Splitting

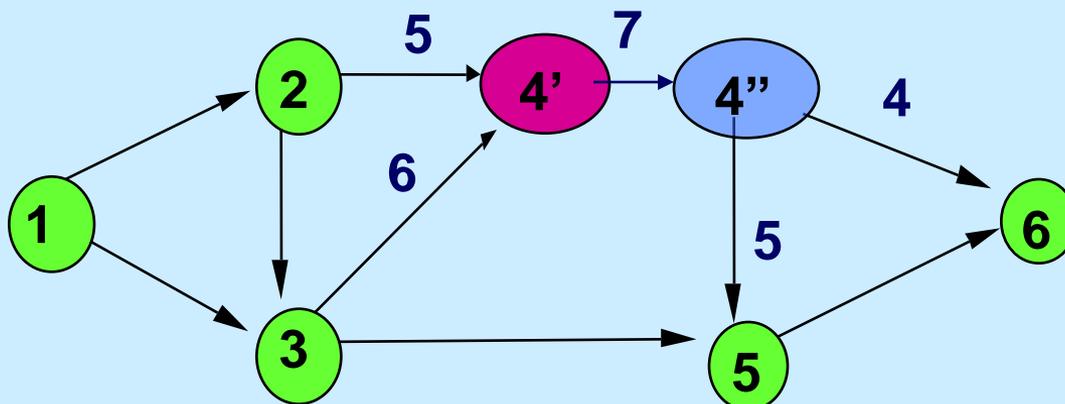


Flow x

Arc numbers
are capacities

Suppose that we want to add the constraint that the flow into node 4 is at most 7.

Method: split node 4 into two nodes, say $4'$ and $4''$



Flow x' can be obtained from flow x , and vice versa.

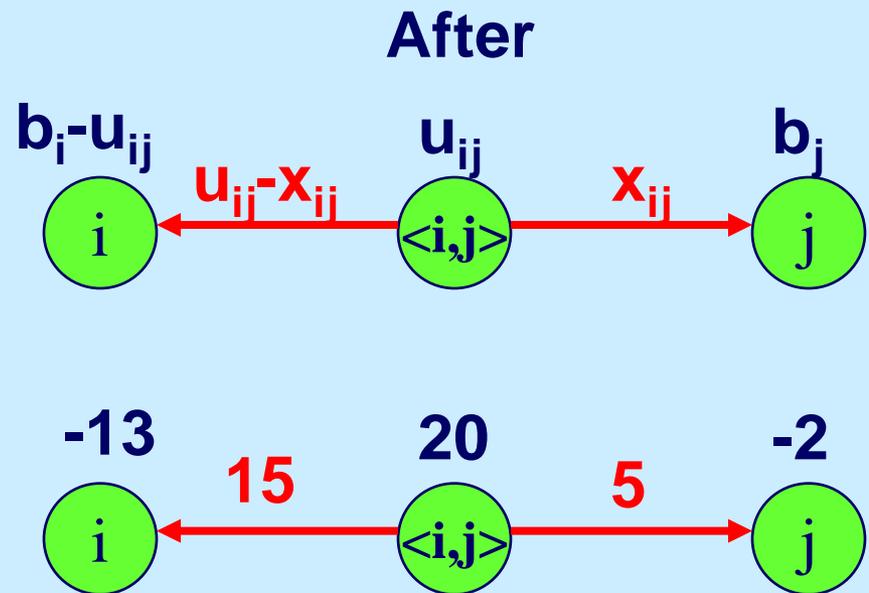
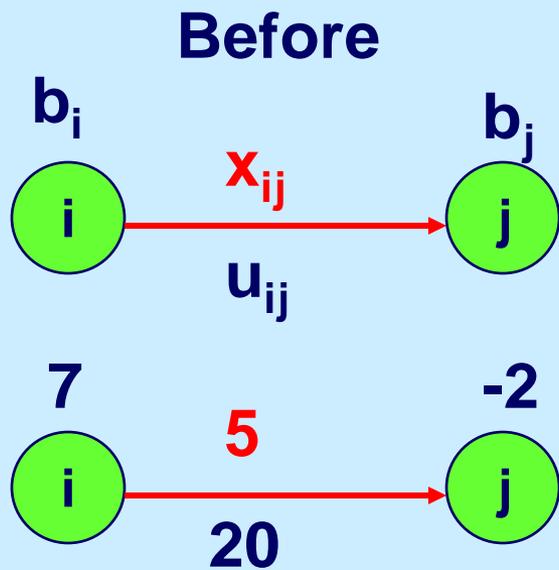
Eliminating Upper Bounds on Arc Flows

The minimum cost flow problem

$$\text{Min } \sum c_{ij} x_{ij}$$

$$\text{s.t. } \sum_j x_{ij} - \sum_k x_{ki} = b_i \text{ for all } i \in N.$$

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



Summary

1. **Efficient implementation of finding an eulerian cycle.**
2. **Flow decomposition theorem**
3. **Transformations that can be used to incorporate constraints into minimum cost flow problems.**

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