

Graph Algorithms - Lecture 9

December 6, 2024

Table of contents

1

Network flows

- Preflows

- General scheme of a preflow algorithm

- Ahuja & Orlin algorithm

- Combinatorial applications

- Bipartite matchings

- Digraphic degree sequences

- Edge Connectivity

- Vertex Connectivity

2

Exercises for the 10th seminar (december 9 - 13 week)

Definition

A preflow in $R = (G, s, t, c)$ is a function $x : E(G) \rightarrow \mathbb{R}$ such that

- $$\begin{aligned} \text{(i)} \quad & 0 \leq x_{ij} \leq c_{ij}, \forall ij \in E; \\ \text{(ii)} \quad & \forall i \neq s, e_i = \sum_{ji \in E} x_{ji} - \sum_{ij \in E} x_{ij} \geq 0. \end{aligned}$$

e_i (for $i \in V \setminus \{s, t\}$) is called the **excess** in node i . If $i \in V \setminus \{s, t\}$ and $e_i > 0$, then i is an **active node**. If $ij \in E$, x_{ij} will be referred as the **flow on the arc ij** .

If in R there are no active nodes, then the preflow x is a flow with $v(x) = e_t$.

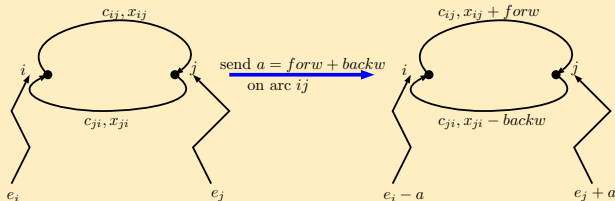
Idea of preflow algorithms: an initial preflow in R is transformed by changing the flow on the arcs in a flow with the property that there are no augmenting paths in R w.r.t. it.

G is represented using adjacency lists. We will suppose that if $ij \in E$, then $ji \in E$ too (otherwise, we add the arc ji with capacity 0). Hence, G is a symmetric digraph.

If x is a preflow in R and $ij \in E$, then the **residual capacity** of ij is

$$r_{ij} = c_{ij} - x_{ij} + x_{ji},$$

(representing the additional flow that can be sent from node i to node j using the arcs ij and ji).



In the following, sending flow from i to j means increasing the flow on the arc ij or decreasing the flow on the arc ji .

An A -path in R w.r.t. preflow x , is any path in G having all arcs with strictly positive residual capacity.

A distance function in R w.r.t. preflow x is a function $d : V \rightarrow \mathbb{Z}_+$ s.t.

$$(D_1) \quad d(t) = 0,$$

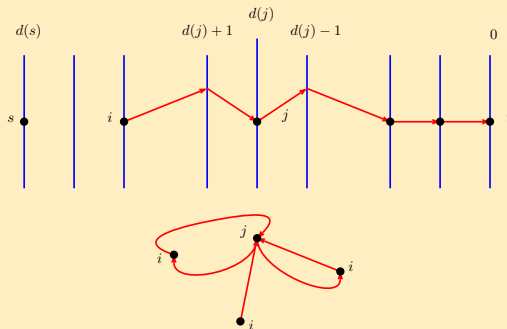
$$(D_2) \quad \forall ij \in E, r_{ij} > 0 \Rightarrow d(i) \leq d(j) + 1.$$

Remarks

- If P is an A -path w.r.t. preflow x in R from i to t , then $d(i) \leq \text{length}(P)$ (the arcs of P have positive residual capacity and we repeatedly use (D_2)). It follows that $d(i) \leq \tau_i$, where τ_i denotes the minimum length of an A -path from i to t .

Remarks

- As usual, we denote by $A(i)$ the adjacency list of the node i .



Definition

Let x be a preflow in R and d a distance function w.r.t. x . An arc $ij \in E$ is called **admissible** if $r_{ij} > 0$ and $d(i) = d(j) + 1$.

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If R is a flow network, we consider the following initialization procedure, which builds in $\mathcal{O}(m)$ a preflow x and a distance function d w.r.t. x .

procedure *initialization*();

for $(ij \in E)$ do

if $(i = s)$ then

$x_{sj} \leftarrow c_{sj}$

else

$x_{ij} \leftarrow 0;$

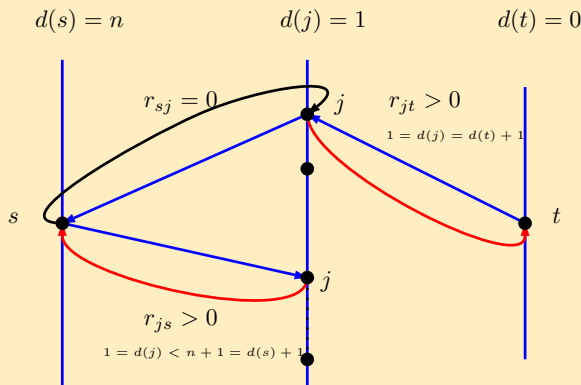
$d[s] \leftarrow n; d[t] \leftarrow 0;$

for $(i \in V - \{s, t\})$ do

$d[i] \leftarrow 1;$

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Note that after the execution of this procedure, we have $r_{sj} = 0, \forall sj \in A(s)$. Hence the condition (D_2) is not affected by taking $d(s) = n$. For all arcs ij , (D_2) is fulfilled:



The choice of $d(s) = n$ means: there are no A -paths from s to t w.r.t. x (otherwise, if P is such a path, its length must be at least $d(s) = n$, which is impossible).

If this will be an invariant of the preflows algorithms; hence, when x will become a flow, it will be a maximum value flow.

Let us consider the following two procedures:

procedure *push*(i); // i is a node different from s, t

choose an admissible arc $ij \in A(i)$;

"send" $\delta = \min\{e_{ij}, r_{ij}\}$ (flow units) from i to j ;

If $\delta = r_{ij}$ then we have a **saturated push**, otherwise we have an **unsaturated push**.

procedure *relabel*(i); // i is a node different from s, t

$d[i] \leftarrow \min\{d[j] + 1 : ij \in A(i) \text{ and } r_{ij} > 0\}$;

Preflows - General scheme of a preflow algorithm

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initialization;

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while ( $\exists$  active nodes in  $R$ ) do
  choose an active node  $i$ ;
  if ( $\exists$  admissible arcs in  $A(i)$ ) then
    push( $i$ );
  else
    relabel( $i$ );
```

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Lemma 1

" d is distance function w.r.t. preflow x " is an invariant of the above algorithm. At each call of *relabel*(i), $d(i)$ increases.

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Preflows - General scheme of a preflow algorithm

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Proof. We already proved that the procedure initialization builds a preflow x and a distance function d w.r.t. x . We show that if the pair (d, x) satisfies (D_1) and (D_2) before an **while** iteration, then after this iteration the two conditions are fulfilled too.

We have two cases, depending on which procedure **push** or **relabel** is called in the current while iteration:

push(i) is called: the only pair that can violate (D_2) is $d(i)$ and $d(j)$. Since ij is admissible, at the $push(i)$ call we have $d(i) = d(j) + 1$. After the call of $push(i)$, the arc ji could have now $r_{ji} > 0$ (without being before the call), but the condition $d(j) \leq d(i) + 1$ is obviously satisfied.

relabel(i) is called: the update of $d(i)$ is such that (D_2) is fulfilled for each arc ij with $r_{ij} > 0$. Since **relabel(i)** is called when $d(i) < d(j) + 1$, $\forall ij$ with $r_{ij} > 0$, it follows that, after the call, $d(i)$ increases (with at least 1). \square

Preflows - General scheme of a preflow algorithm

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In order to show that the algorithm terminates, it is necessary to show that (during the execution) if a node i is active then in its adjacency list, $A(i)$, there is at least one arc ij cu $r_{ij} > 0$. This follows from the next lemma.

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Lemma 2

If i_0 is an x -active node in R , then there is an i_0 's A -path w.r.t. x .

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Proof. If x is a preflow in R , then x can be decomposed $x = x^1 + x^2 + \dots + x^p$, where each x^k has the property that the set $A^k = \{ij : ij \in E, x_{ij}^k \neq 0\}$ is

- (a) the set of the arcs of a path from s to t , or
- (b) the set of arcs of a path from s to an active node, or
- (c) the set of arcs of a cycle.

Preflows - General scheme of a preflow algorithm

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Moreover, in the cases (a) and (c), x^k is a flow. (The proof is algorithmic: we construct firstly the sets of type (a), than those of type (c) and (b); at each stage, we search the converse of a path of the type (a) or (c) (or (b)); the preflow obtained is subtracted from the current one; since the excesses of the nodes are non-negative, the construction can be realized, whenever the current preflow is non null; the construction is finite, since the number of arcs on which the current flow is 0, increases at each stage of it.)

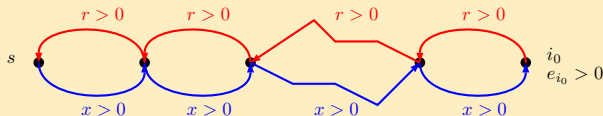
Since i_0 is an active node in R w.r.t. x , it follows that the case (b) will occur for the node i_0 (the cases (a) and (c) does not affect the excess in the node i_0). The converse arcs of this path have positive residual capacity (see the figure bellow), therefore they form the required A -path.

□

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Corollary 1

$\forall i \in V, d(i) < 2n.$

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Proof. Indeed, if i has not been relabelled, then $d(i) = 1 < 2n$. Otherwise, before the call of $relabel(i)$, i is an active node, hence by Lemma 2, there is an is A -path P with $length(P) \leq n - 1$. By (D_2) , it follows that, after the relabel, $d(i) \leq d(s) + n - 1 = 2n - 1$ ($d(s) = n$ is never changing). \square

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Preflows - General scheme of a preflow algorithm

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Corollary 2

The total number of calls of the procedure relabel is not greater than $2n^2$.

Proof. Indeed, there are $n - 2$ nodes which can be relabelled. Each of them can be relabelled at most of $2n - 1$ times (by Lemma 1, the above Corollary, and the initial distance d). \square

Corollary 3

The total number of saturated pushes is not greater than nm .

Proof. Indeed, when an arc ij becomes saturated, we have $d(i) = d(j) + 1$. After that, the algorithm cannot send flow on this arc until it sends flow on the arc ji , when we have $d'(j) = d'(i) + 1 \geq d(i) + 1 = d(j) + 2$.

Preflows - General scheme of a preflow algorithm

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Proof cont'd. Hence this flow change on the arc ij does not occur until $d(j)$ increases with 2. It follows that an arc can not become saturated more than n times and there are no more than nm saturated pushes (since the total number of arcs is m). \square

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Lemma 3

(Goldberg and Tarjan, 1986). The total number of unsaturated pushes is not greater than $2n^2m$.

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Proof. Omitted.

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Lemma 4

The preflow algorithm outputs a maximum value flow x in R .

Preflows - General scheme of a preflow algorithm

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Proof. By Lemmas 1 and 3 and by Corollary 3 of Lemma 2, the algorithm terminates in at most $\mathcal{O}(n^2m)$ while iterations. Since $d(s) = n$ is never modified, it follows that there is no augmenting path w.r.t. the flow x obtained, hence x is of maximum value: if P is an augmenting path (in the support graph of G), then, by replacing along P each backward arc with its symmetric arc, we get an A -path from s to t , hence $n = d(s) \leq d(t) + n - 1 = n - 1$. \square

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Instead of proving Lemma 3, we will present the **Ahuja & Orlin algorithm (1988)** that uses a **scaling method** to reduce the number of unsaturated pushes from $\mathcal{O}(n^2m)$ (**Goldberg & Tarjan algorithm**) to $\mathcal{O}(n^2 \log U)$.

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Suppose that $c_{ij} \in \mathbb{N}$ and $U = \max_{ij \in E} (1 + c_{ij})$. Let $K = \lceil \log_2 U \rceil$.

Algorithm's idea: We have $K + 1$ stages. For each stage p , with p taking successively the values $K, K - 1, \dots, 1, 0$, the following two conditions are fulfilled:

- (a) at the beginning of stage p , $e_i \leq 2^p, \forall i \in V \setminus \{s, t\}$.
- (b) during the stage p , the procedures push-relabel are used in order to eliminate the active nodes, i , with $e_i \in \{2^{p-1} + 1, \dots, 2^p\}$.

By the definition of K , in the first stage ($p = K$), property (a) holds (after the initialisation of the preflow we have $e_i = c_{si}$ or $e_i = 0$, for each $i \neq s, t$, hence $e_i \leq U$), and, if property (b) will be maintained during the algorithm (if the integrality of excesses is also maintained during the algorithm), it follows that, after stage $K + 1$, the excess of each node $i \in V \setminus \{s, t\}$ is 0, therefore we have a flow of maximum value.

In order to maintain the condition (b) during the algorithm, the general scheme of a preflow algorithm is adapted as follows:

- each stage p starts by constructing the list $L(p)$ of all nodes $i_1, i_2, \dots, i_{l(p)}$ with excesses $e_i > 2^{p-1}$, sorted non-decreasing by d (this can be done with a hash-sorting in $O(n)$ time, since $d(i) \in \{1, 2, \dots, 2n - 1\}$).
- the active node selected for **push-relabel** during the stage p will be the **first node in** $L(p)$. It follows that, if a push is done on the admissible arc ij , then $e_i > 2^{p-1}$ and $e_j \leq 2^{p-1}$ (because $d(j) = d(i) - 1$ and i is the first node in $L(p)$). If δ , the flow sent from i to j by $push(i)$, is limited to $\delta = \min(e_i, r_{ij}, 2^p - e_j)$, then (since $2^p - e_j \geq 2^{p-1}$) it follows that an **unsaturated push** sends at least 2^{p-1} unit flows.

After the execution of *push*(i) the excess from node j (the only one for which the excess can increase) will be $e_j + \min(e_i, r_{ij}, 2^p - e_j) \leq e_j + 2^p - e_j \leq 2^p$, therefore (b) holds.

- the stage p is over when the list $L(p)$ becomes empty.

In order to find efficiently an admissible arc for doing the *push*, or to inspect all the arcs leaving a node i for doing *relabel*, we will organize the adjacency lists $A(i)$ as follows:

- each list's node contains: the node j , x_{ij} , r_{ij} , a pointer to the arc ji (from the adjacency list $A(j)$), and a pointer to the next node from the list $A(i)$.
- the list has associated an iterator to enable its traversal.

All these lists are constructed in $O(m)$ time, before the call of the procedure *initialization*.

Preflows - Ahuja & Orlin algorithm

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initialization;  $K \leftarrow \lceil \log_2 U \rceil$ ;  $\Delta \leftarrow 2^{K+1}$ ;  
for ( $p = \overline{K, 0}$ ) do  
  construct  $L(p)$ ;  $\Delta \leftarrow \Delta/2$ ;  
  while ( $L(p) \neq \emptyset$ ) do  
    let  $i$  the first node in  $L(p)$ ;  
    search in  $A(i)$  for an admissible arc;  
    if ( $ij$  is the admissible arc found) then  
       $\delta \leftarrow \min(e_i, r_{ij}, \Delta - e_j)$ ;  
       $e_i \leftarrow e_i - \delta$ ;  $e_j \leftarrow e_j + \delta$ ;  
      "send"  $\delta$  unit flows from  $i$  to  $j$ ;  
      if ( $e_i \leq \Delta/2$ ) then  
        delete  $i$  from  $L(p)$ ;  
      if ( $e_j > \Delta/2$ ) then  
        add  $j$  as the first node in  $L(p)$ ;  
    else  
      compute  $d[i] = \min\{d[j] + 1 : ij \in A(i) \text{ and } r_{ij} > 0\}$   
      reposition  $i$  in  $L(p)$ ;  
      set the current pointer at the beginning of  $A(i)$ ;
```

Preflows - Ahuja & Orlin algorithm

The complexity time of the algorithm is dominated by **unsaturated pushes** (all the remaining parts need $\mathcal{O}(nm)$ time).

Lemma 5

The number of unsaturated pushes is at most $8n^2$ in each stage of the scaling, hence the total number is $\mathcal{O}(n^2 \log U)$.

Proof. Let

$$F(p) = \sum_{i \in V, i \neq s, t} \frac{e_i \cdot d(i)}{2^p}.$$

At the begining of stage p , $F(p) < \sum_{i \in V} \frac{2^p \cdot (2n)}{2^p} = 2n^2$.

If, in the stage p , is executed $relabel(i)$, then there are no admissible arcs ij , and $d(i)$ is increased with $h \geq 1$ units. $F(p)$ will increase by at most h . Since, $\forall i, d(i) < 2n$ it follows that $F(p)$ will increase (until the end of the p stage) at most up to $4n^2$.

If, in the stage p , is executed $push(i)$, then this sends $\delta \geq 2^{p-1}$ on the admissible arc ij with $r_{ij} > 0$ and $d(i) = d(j) + 1$. Hence, after the push, $F(p)$ will have the value $F'(p) = F(p) - \frac{\delta \cdot d(i)}{2^p} + \frac{\delta \cdot d(j)}{2^p} = F(p) - \frac{\delta}{2^p} \leq F(p) - \frac{2^{p-1}}{2^p} = F(p) - 1/2$.

This decrease cannot occur more than $8n^2$ times (because $F(p)$ can increase at most up to $4n^2$ and $F(p)$ is non-negative). Clearly, the number of unsaturated pushes is dominated by this number of decreases of $F(p)$.

A. Finding a maximum cardinality matching and a maximum stable set in a bipartite graph.

Let $G = (V_1, V_2; E)$ be bipartite graph with n vertices and m edges. Consider the network $R = (G_1, s, t, c)$, where

- $V(G_1) = \{s, t\} \cup V_1 \cup V_2$;
- $E(G_1) = E_1 \cup E_2 \cup E_3$, with

$$E_1 = \{sv_1 : v_1 \in V_1\}, E_2 = \{v_2t : v_2 \in V_2\},$$

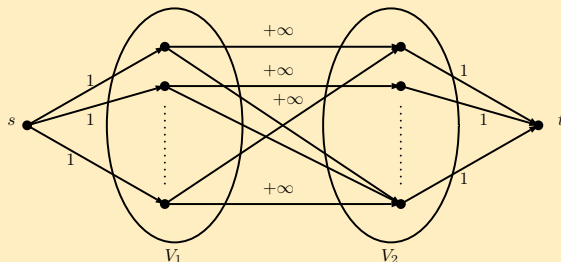
$$E_3 = \{v_1v_2 : v_1 \in V_1, v_2 \in V_2, v_1v_2 \in E(G)\},$$

- $c : E(G_1) \rightarrow \mathbb{N}$ defined by

$$c(e) = \begin{cases} 1, & \text{if } e \in E_1 \cup E_2 \\ \infty, & \text{if } e \in E_3 \end{cases}$$

Combinatorial applications - Bipartite matchings

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If $x = (x_{ij})$ is an integral flow in R , then the set $\{ij : i \in V_1, j \in V_2 \text{ and } x_{ij} = 1\}$ corresponds to a matching M^x in the bipartite graph G , with $|M^x| = v(x)$.

Conversely, any matching $M \in \mathcal{M}_G$ gives rise to a set of non-adjacent arcs in G_1 ; if on each such arc ij ($i \in V_1, j \in V_2$) we consider $x_{ij}^M = 1$ and $x_{si}^M = x_{jt}^M = 1$, and we put $x^M(e) = 0$ on any other arc, then the integral flow x^M satisfies $v(x^M) = |M|$.

Combinatorial applications - Bipartite matchings

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Hence, if we solve the maximum flow problem in R (starting with the null flow), then we obtain in $\mathcal{O}(nm + n^2 \log n)$ time a maximum cardinality matching in G . (the constant replacing $+\infty$ must be an integer greater than the cardinality of any cut, e. g. $n^2 + 1$ - see below.)

Let (S, T) be the minimum capacity cut (obtained in $\mathcal{O}(m)$ time from the maximum flow found). By the Max-flow Min-cut Theorem, $c(S, T) = \nu(G)$.

Since $\nu(G) < \infty$, taking $S_i = S \cap V_i$ and $T_i = T \cap V_i$ ($i = \overline{1, 2}$), we have $|T_1| + |S_2| = \nu(G)$ and $X = S_1 \cup T_2$ is a stable set in G (in order to have $c(S, T) < \infty$). Moreover, $|X| = |V_1 \setminus T_1| + |V_2 \setminus S_2| = n - \nu(G)$. It follows that X is a maximum cardinality stable set, since $n - \nu(G) = \alpha(G)$ (by König theorem).

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B. Recognizing digraphic degree sequences

Let us consider the following problem:

Given $(d_i^+)_{i=\overline{1,n}}$ and $(d_i^-)_{i=\overline{1,n}}$, is there a digraph $G = (\{1, \dots, n\}, E)$ such that $d_G^+(i) = d_i^+$ and $d_G^-(i) = d_i^-, \forall i = \overline{1,n}$?

Obvious necessary conditions in order to have a "yes instance" are:

$$d_i^+ \in \mathbb{N}, 0 \leq d_i^+ \leq n-1 \text{ and } d_i^- \in \mathbb{N}, 0 \leq d_i^- \leq n-1, \forall i = \overline{1,n};$$

$$\sum_{i=1}^n d_i^+ = \sum_{i=1}^n d_i^- = m \text{ (where } m = |E| \text{)}.$$

In this hypothesis, consider the bipartite flow network $R = (G_1, s, t, c)$.

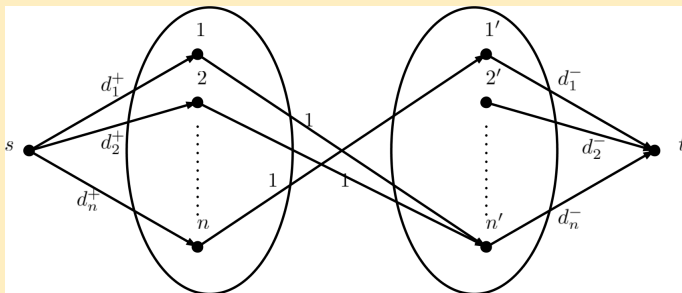
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Combinatorial applications - Digraphic degree sequences

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G_1 is obtained from a complete bipartite graph $K_{n,n}$ with bipartition $(\{1, 2, \dots, n\}, \{1', 2', \dots, n'\})$, by removing the set of edges $\{11', 22', \dots, nn'\}$ and by orienting each edge ij' ($\forall i \neq j \in \{1, 2, \dots, n\}$) from i to j' , and by adding two new vertices s, t , and all arcs si , $i \in \{1, 2, \dots, n\}$ and $j't$, $j \in \{1, 2, \dots, n\}$.

The capacity function: $c(si) = d_i^+$, $c(j't) = d_j^-$, $c(ij') = 1$, $\forall i, j = \overline{1, n}$.



Combinatorial applications - Digraphic degree sequences

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If in R there is an integral flow, x , of maximum value m , then from each vertex i will leave exactly d_i^+ arcs, ij' , on which $x_{ij'} = 1$, and in each vertex j' will enter exactly d_i^- arcs, ij' , on which $x_{ij'} = 1$.

The desired digraph, G , is constructed by taking $V(G) = \{1, 2, \dots, n\}$ and putting $ij \in E(G)$ if and only if $x_{ij'} = 1$.

Conversely, if G exists, then by inverting the above construction we obtain an integral flow in R of value m (hence, of maximum value).

It follows that, the recognition of digraph sequences (and digraph realization, for positive answer) can be done in $\mathcal{O}(nm + n^2 \log n) = \mathcal{O}(n^3)$.

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- Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms *

C. Finding the edge-connectivity number of a graph

Let $G = (V, E)$ be a graph. For $s, t \in V$, $s \neq t$, we denote

- $p_e(s, t)$ = maximum number of edge-disjoint paths from s to t in G ,
- $c_e(s, t)$ = minimum cardinality of a set of edges such that there is no path from s to t in the graph obtained by removing it from G .

Theorem

$$p_e(s, t) = c_e(s, t).$$

Proof. Let G_1 be the digraph obtained from G by replacing each edge by a pair of symmetric arcs. Let $c : E(G_1) \rightarrow \mathbb{N}$ a capacity function defined by $c(e) = 1, \forall e \in E(G_1)$.

Proof cont'd. Let x^0 be an integral flow of maximum value in $R = (G_1, s, t, c)$. If there exists a cycle C in G_1 with $x_{ij}^0 = 1$ on all arcs of C , then we can put to 0 the flow on the arcs of C without changing the value of the flow x_0 . Hence, we can suppose that the flow x^0 is acyclic and then x^0 can be expressed as a sum of $v(x^0)$ integral flows x^k with $v(x^k) = 1$.

Each flow x^k corresponds to a path from s to t in G_1 (by taking the arcs on which the flow is not 0), which is a path from s to t also in the graph G .

It follows that $v(x^0) = p_e(s, t)$, since any set of edge-disjoint paths from s to t in G generates a 0 – 1-flow in R of value equal to the number of these paths.

Proof cont'd. Let (S, T) be a minimum capacity cut in R ; we have $c(S, T) = v(x^0)$, by the Max-flow Min-cut theorem. On the other hand, $c(S, T)$ is the number of arcs with an extremity in S and the other in T (since the arcs capacities are all 1). This set of arcs generates in G a set of edges of the same cardinality and such that there is no path from s to t in the graph obtained by removing it from G .

Hence we obtained a cut of capacity $c(S, T) = v(x^0) = p_e(s, t)$ edges in G which disconnects s from t by their removing from G . It follows that $c_e(s, t) \leq p_e(s, t)$. Since the inequality $c_e(s, t) \geq p_e(s, t)$ is obvious, the theorem is proved. \square

If G is a connected graph, $\lambda(G)$, the maximum value of $p \in \mathbb{N}$ for which G is p -edge-connected, is

$$\min_{s, t \in V(G), s \neq t} c_e(s, t) (*)$$

Combinatorial applications - Edge Connectivity

C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms
* C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph

It follows that, to compute $\lambda(G)$, it is necessary to solve the $n(n-1)/2$ maximum flow problems described in the above proof. This number can be reduced if we observe that, for a fixed pair (s, t) , if (S, T) is a minimum capacity cut, then

$$\forall v \in S \text{ and } \forall w \in T \quad c_e(v, w) \leq c(S, T) (**)$$

In particular, if (s, t) is the pair for which the minimum in $(*)$ is attained, we have equality in $(**)$.

If we fix a vertex $s_0 \in V$ and solve the $n-1$ maximum flow problems by taking $t_0 \in V \setminus \{s_0\}$ we will obtain a pair (s_0, t_0) with $c(s_0, t_0) = \lambda(G)$ (t_0 will be not in the same class with s_0 in the bi-partition (S, T)).

Conclusion: $\lambda(G)$ can be found in $\mathcal{O}(n \cdot (nm + n^2 c)) = \mathcal{O}(n^2 m)$ time.

- Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms *

D. Finding the vertex-connectivity number of a graph.

Let $G = (V, E)$ be a graph. For $s, t \in V$, $s \neq t$, if we denote

- $p(s, t)$ = maximum number of internal vertex disjoint st -paths in G ,
- $c(s, t)$ = minimum cardinality of a st -separating set of vertices in G ,

then, by Menger Theorem, we have

$$p(s, t) = c(s, t) (***)$$

Moreover, the vertex-connectivity number, $k(G)$, of the graph G (the maximum value of $p \in \mathbb{N}$ for which G is p -connected) is

$$k(G) = \begin{cases} n - 1, & \text{if } G = K_n \\ \min_{s, t \in V(G), s \neq t, st \notin E(G)} c(s, t), & \text{if } G \neq K_n \end{cases} (***)$$

Combinatorial applications - Vertex Connectivity

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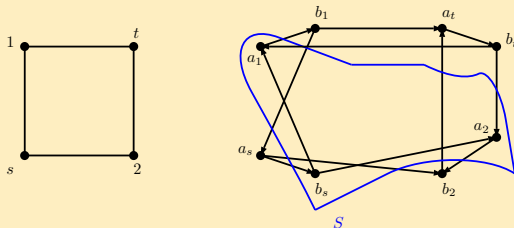
We show that the equality $(***)$ follows from the Max-flow Min-cut theorem, on an appropriate flow network.

Let $G_1 = (V(G_1), E(G_1))$ be the digraph constructed from G as follows:

- $\forall v \in V$, we put $a_v, b_v \in V(G_1)$ and $a_v b_v \in E(G_1)$;
- $\forall vw \in E$, we put $b_v a_w, b_w a_v \in E(G_1)$.

- Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C.

Example



Also, define $c : E(G_1) \rightarrow \mathbb{N}$ by

$$c(e) = \begin{cases} 1, & \text{if } e = a_v b_v \\ \infty, & \text{otherwise} \end{cases}$$

Let us consider the flow network $R = (G_1, b_s, a_t, c)$.

Let x^0 be an integral flow in R of maximum value. In the nodes $b_v (v \in V)$ enters exactly one arc of capacity 1 and from the nodes $a_v (v \in V)$ leaves exactly one arc of capacity 1.

It follows (by the flow equilibrium constraints) that $x_{ij}^0 \in \{0, 1\}$, $\forall ij \in E(G_1)$. Therefore x^0 can be decomposed in $v(x^0)$ flows x^k , each of value 1, with the property that the arcs on which x_k is non null correspond to $v(x^0)$ internal disjoint paths in G .

On the other hand, from any set of p internal disjoint st -paths in G , we can construct p internal disjoint $b_s a_t$ -paths in G_1 , on which we can transport one unit of flow. It follows that $v(x^0) = p(s, t)$.

Let (S, T) be a minimum capacity cut in R such that $v(x^0) = c(S, T)$. Since $v(x^0) < \infty$, it follows that $\forall i \in S, \forall j \in T$ with $ij \in E(G_1)$; we have $c(ij) < \infty$, therefore $c(ij) = 1$, that is $\exists u \in V$ such that $i = a_u$ and $j = b_u$.

Hence, the cut (S, T) corresponds to a set of vertices $A_0 \subseteq V$ such that $c(S, T) = |A_0|$ and A_0 is a st -separating set.

On the other hand, $\forall A$ st -separating set, $|A| \geq p(s, t) = v(x^0)$. Therefore

$$c(s, t) = |A_0| = c(S, T) = v(x^0) = p(s, t).$$

The above proof, which, on one hand, completes the proof of the Menger's theorem from lecture 5, shows, on the other hand, that, in order to find $k(G)$ will be sufficiently to find the minimum in (***) by solving $|E(\overline{G})|$ maximum flow problems, where \overline{G} is the complement of G .

Combinatorial applications - Vertex Connectivity

C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms
* C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph

This gives an algorithm with time complexity

$$\mathcal{O}\left(\left(\frac{n(n-1)}{2} - m\right)(nm + n^2 \log n)\right).$$

A simple observation gives us a more efficient algorithm. Obviously,

$$k(G) \leq \min_{v \in V} d_G(v) = \frac{1}{n} \left(n \cdot \min_{v \in V} d_G(v) \right) \leq \frac{1}{n} \sum_{v \in V} d_G(v) = \frac{2m}{n}.$$

If A_0 is a cut-set in G with $|A_0| = k(G)$, then $G \setminus A_0$ is not connected and there exists a partition of $V \setminus A_0$ (V', V'') such that there is no edge in cross between V' and V'' and $\forall v' \in V', \forall v'' \in V''$ we have $p(v', v'') = k(G)$.

- Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms *

Combinatorial applications - Vertex Connectivity

It follows that solving a maximum flow problem with $s_0 \in V'$ and $t_0 \in V''$ we obtain that $p(s_0, t_0) = \text{maximum flow value} = k(G)$.

We can find such a pair like follows: let $l = \left\lceil \frac{2m}{n} \right\rceil + 1$, choose l vertices arbitrary from $V(G)$, and for each such vertex, v , solve all maximum flow problems $p(v, w)$, with $vw \notin E$. The number of such problems is $\mathcal{O}(nl) = \mathcal{O}\left(n \left(\left\lceil \frac{2m}{n} \right\rceil + 1\right)\right) = \mathcal{O}(m)$.

Hence the time complexity of finding $k(G)$ is $\mathcal{O}(m(nm + n^2 \log n))$.

Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms *
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- Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms *

Exercises for the 10th seminar

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Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru -

Exercise 1. Show that, by using a maximum flow algorithm (in a certain network), you can find, in a 0 - 1 matrix, a maximum cardinality set of elements equals with 0, in which any two elements are not on the same row or column.

Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru

Exercise 2. Let S and T be two disjoint, finite, and non-empty sets. We have a function $a : S \cup T \rightarrow \mathbb{N}$. The requirement is to decide whether exists a bipartite graph $G = (S, T; E)$ such that $d_G(v) = a(v)$, for all $v \in S \cup T$; if the answer is affirmative you have to return the edges of G (S and T are the classes of the bipartition in G). Show that this problem can be polynomially solved as a maximum value flow problem in a certain network.

Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru
- Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms *

Exercise 3. Every student from a cardinal $n > 0$ set S choose a subset of 4 optional courses from a cardinal $k > 4$ set C . Conceive an algorithm (with polynomial time complexity) which has determine (if exists) an allocation of the students to optional courses from C such that every student will be allocated to exactly 3 courses (from those 4 already chosen) and each course gathers at most $\lceil \alpha \cdot n/k \rceil$ students ($\alpha \geq 3$).

Exercise 4.

- (a) True or false? In a network $R = (G, s, t, c)$ having distinct capacities there is an unique maximum value flow. Why?
- (b) Devise and prove the corectness of a polynomial time complexity algorithm which has to decide that if in a given network there is an unique maximum flow.

Exercises for the 10th seminar

C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms
* C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph

Exercise 5. An IT company has n employees P_1, P_2, \dots, P_n which has to accomplish m projects L_1, L_2, \dots, L_m . For any employee P_i we have a list \mathcal{L}_i of projects on which he can work, and s_i the number of projects from \mathcal{L}_i which can be accomplished by him in a week ($s_i \leq |\mathcal{L}_i|$). Any project will be assigned to one employee.

How can you find the minimum number of weeks required to finish all the projects by using flows in networks?

* C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph

Exercise 6. The emergency evacuation plan of a building is described as a $n \times n$ grid; the cells borders of this grid are the escape routes to the outside of the building (grid). An instance of the **evacuation problem** contains the dimension n of the grid an m starting points (corners of the cells).

- Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms *

Exercises for the 10th seminar

C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms
* C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph

Exercise 6 (cont'd). The instance has a positive answer if there are m disjoint paths towards grid frontier starting in the above m points. If such paths do not exist, then the instance has a negative answer. Find a representation of this *evacuation problem* as a flow problem in a flow transportation network. Devise an efficient algorithm to recognize a positive instance of the evacuation problem (what is its time complexity?).

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Exercise 7. Let $G = (V, E)$ be a graph having n vertices $\{v_1, v_2, \dots, v_n\}$ and $c : E \rightarrow \mathbb{R}_+$ a capacity function on the edges of G . A **cut** in G is a bipartition (S, T) of V . The capacity of a cut (S, T) is $c(S, T) = \sum_{e \in E, |e \cap S|=1} c(e)$.

- Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms *

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Exercise 7 (cont'd). A **minimum cut** in G is a cut (S_0, T_0) such that

$$c(S_0, T_0) = \min_{(S, T) \text{ cut in } G} c(S, T)$$

- (a) Show that we can determine a minimum cut in polynomial time complexity by solving a polynomial number of maximum flow problems in certain networks.
- (b) For $G = C_n$ (the induced cycle of order $n \geq 3$) having all capacities 1, prove that there are $\frac{n(n-1)}{2}$ minimum cuts.

C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph
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- Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms *

Exercise 8. Let $G = (V; E)$ be a digraph and $w : V \rightarrow \mathbb{R}$ such that $w(V) \cap \mathbb{R}_+, w(V) \cap \mathbb{R}_- \neq \emptyset$. A subset $A \subseteq V$ is called a *isolated* subset of G if there is no arc that leaves A . The *weight* of $A \subseteq V$ is $w(A) = \sum_{v \in A} w(v)$. Describe a polynomial time complexity using a maximum value flow algorithm in a certain network that has to find a maximum weight isolated subset of G .

Exercise 9. At the CS department there are p students ($S = \{S_1, S_2, \dots, S_p\}$) who want to graduate and k professors ($\mathcal{P} = \{P_1, P_2, \dots, P_k\}$). For the final graduate examination (also called exit examination) teams of r professors will judge the students final projects. For a given project each professor either has the competences to judge it or not, i. e., we know the set, $\mathcal{P}_i \subsetneq \mathcal{P}$ ($\mathcal{P}_i \neq \emptyset$), of professors specialized on the project of student S_i . Each professor P_j can participate to at most n_j teams.

Exercises for the 10th seminar

C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms
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Exercise 9 (cont'd) Each student must present this project to a team of $r (\leq k)$ professors, $a (\leq r)$ of them being specialized on this project and the remaining $(r - a)$ are not.

- (a) Devise a network flow model to organize the judging teams (which professor will attend which project presentation).
- (b) Give a characterization of the existence of a solution to this problem in terms of maximum flow in the above network.
- (c) What is the time complexity for deciding if a solution exists?

C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms * C. Croitoru - Graph Algorithms
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