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**GRAPH-THEORETIC ALGORITHMS
 FOR SPARSE MATRIX TRANSFORMATIONS**

This paper presents three algorithms for transforming a given sparse matrix A into a block diagonal form and into a block upper triangular form by using only row and column permutations. These reduced forms of a matrix allow us to partition some numerical problems into those of smaller sizes. Graph-theoretic results are used in the presented algorithms.

1. THE PROBLEM AND ITS APPLICATION

Let A be a square matrix whose entries are in some field. Without loss of generality we may assume the non-zero elements of A to be equal to 1. Let P, Q , and R denote the permutation matrices. A matrix A is *decomposable* if there exist permutation matrices P and Q such that

$$(1) \quad PAQ = \begin{bmatrix} A_{11} & & & & 0 \\ & A_{22} & & & \\ 0 & & \cdot & \cdot & \\ & & & \cdot & \\ & & & & A_{kk} \end{bmatrix},$$

where A_{ii} ($i = 1, 2, \dots, k$) are square submatrices, otherwise A is *indecomposable*. Similarly, a matrix A is *reducible* if there exist permutation matrices P and Q such that

$$(2) \quad PAQ = \begin{bmatrix} A_{11} & A_{12} & \dots & A_{1k} \\ & A_{22} & \dots & A_{2k} \\ 0 & & \cdot & \cdot \\ & & & \vdots \\ & & & & A_{kk} \end{bmatrix},$$

otherwise A is *irreducible*.

There are several numerical problems related to matrices which can be simplified if a matrix is decomposable or reducible. For instance:

- (i) Computation of the determinant $\det(A)$ of a matrix A ,

$$\det(A) = \det(PAQ) = \prod_{i=1}^k \det(A_{ii}).$$

(ii) Finding the inverse A^{-1} of a non-singular matrix A ,

$$A^{-1} = Q(PAQ)^{-1}P.$$

A is non-singular if and only if every submatrix A_{ii} ($i = 1, 2, \dots, k$) is non-singular. Thus the inverse of a given matrix can be expressed in terms of the inverses of submatrices A_{ii} ($i = 1, 2, \dots, k$). If a matrix A is decomposable, then

$$(PAQ)^{-1} = \begin{bmatrix} A_{11}^{-1} & & & \\ & A_{22}^{-1} & & 0 \\ & 0 & \ddots & \\ & & & A_{kk}^{-1} \end{bmatrix},$$

and if A is reducible, then A^{-1} can be computed by iterating the following formula for $k = 2$:

$$(PAQ)^{-1} = \begin{bmatrix} A_{11}^{-1} & -A_{11}^{-1}A_{12}A_{22}^{-1} \\ 0 & A_{22}^{-1} \end{bmatrix}.$$

(iii) Solving the system of linear equations $Ax = b$.

The system of linear equations with a decomposable matrix A can be split into independent subsystems. Firstly we solve the system $(PAQ)y = Pb$ and then $x = Qy$.

(iv) Finding eigenvalues of a matrix A .

If a matrix A is decomposable or reducible by using P and $Q = P^{-1}$, then

$$\det(A - \lambda I) = \det(PAP^{-1} - \lambda I) = \prod_{i=1}^k \det(A_{ii} - \lambda I),$$

i.e., the set of eigenvalues of A is the union of the sets of eigenvalues of submatrices A_{ii} ($i = 1, 2, \dots, k$). Let us write

$$(3) \quad PAP^{-1} = \begin{bmatrix} A_{11} & & & 0 \\ & A_{22} & & \\ & 0 & \ddots & \\ & & & A_{kk} \end{bmatrix},$$

$$(4) \quad PAP^{-1} = \begin{bmatrix} A_{11} & A_{12} & \dots & A_{1k} \\ & A_{22} & \ddots & A_{2k} \\ & 0 & \ddots & \vdots \\ & & & A_{kk} \end{bmatrix}.$$

The paper presents three procedures for finding transformations of forms (4), (2), and (1) (transformation (3) is a special form of (4)).

2. PRELIMINARY DEFINITIONS

Let $D = \langle X, U \rangle$ be a *directed graph (digraph)*, where X is the set of vertices and U is the set of arcs, i.e., the set of ordered pairs of vertices.

Let $A = (a_{ij})$ ($i, j = 1, 2, \dots, n = |X|$) denote the *adjacency matrix* of D with elements a_{ij} defined by

$$a_{ij} = \begin{cases} 1 & \text{if } (i, j) \in U, \\ 0 & \text{otherwise.} \end{cases}$$

The *transitive closure* $\check{D} = \langle X, \check{U} \rangle$ of D is a digraph such that $(i, j) \in \check{U}$ if and only if there is a path in D going from the vertex i to the vertex j .

Let $\check{A} = (\check{a}_{ij})$ denote the adjacency matrix of \check{D} .

A digraph D is *strongly connected* if any two vertices of D are mutually reachable by directed paths. A *strongly connected component* of D is a maximal strongly connected subdigraph.

The *condensation* $D^* = \langle X^*, U^* \rangle$ of D is that digraph whose vertices correspond to the strongly connected components of D and whose arcs are induced by those of D .

A digraph $D = \langle X, U \rangle$ is *bipartite* if there exists a partition $S \cup T$ of X such that $S \cap T = \emptyset$ and if $(s, t) \in U$, then either $s \in S$ and $t \in T$ or $t \in S$ and $s \in T$.

3. METHOD USED

3.1. Procedure *matrixpermp*. Procedure *matrixpermp* finds the permutation matrix P which reduces a given matrix A to the block triangular form (4).

Regard A as the adjacency matrix of a digraph D . The set of labelled vertices of D consists of n elements such that the i -th vertex of D corresponds to the i -th row and to the i -th column of A .

An algorithm for finding whether A is reducible is based on the following statements (see [6], [7], and [12] for details).

LEMMA 1. *A matrix A is irreducible to form (4) if and only if the digraph D associated with A is strongly connected.*

LEMMA 2. *Each vertex of D is in exactly one strongly connected component of D .*

LEMMA 3. *A matrix A is decomposable to form (4) if and only if the condensation D^* of D has at least two vertices and no arc.*

The algorithm can be described as follows.

Step 1. Find the strongly connected components of D . The depth-first search technique has been used in this step (see [4] and [14]).

```

procedure matrixpermp(n,p,nrp,f,np);
  value n;
  integer n;
  Boolean f;
  integer array p,nrp,np;
  comment (1) The procedure finds the permutation
    matrix P which reduces a given matrix A to the
    block triangular form (4);
  begin
    integer i,j,l,m,s;
    integer array c[1:n];
    procedure strongconnect(l,c);
      integer l;
      integer array c;
      comment (2) The procedure strongconnect is a re-
        alization of Tarjan's method [14] for finding
        the strongly connected components of the digraph
        D associated with A.
        Data for procedure strongconnect: n,p[1:m],nrp
        [0:n] are the global variables of procedure ma-
        trixpermp.
        Results of procedure strongconnect:
          1 - the number of strongly connected compo-
            nents of D,
          c[1:n] - array which contains vertex numbers of
            consecutive strongly connected compo -
            nents of D. The number of the first ver-
            tex of each component is negative;
    begin
      integer i,j,m,s;

```



```

        if k2<lab[v]
            then lab[v]:=k2;
            go to Y
            and j;
Y:      end k2<num[v]
        end w1;
        k1:=num[v];
        if lab[v]=k1
            then
                begin
                    l:=l+1;
                    for j:=s step -1 until 1 do
                        begin
                            k2:=stos[j];
                            if num[k2]>k1
                                then
                                    begin
                                        m:=m+1;
                                        c[m]:=k2
                                        end num[k2]>k1
                                    else go to L
                                end j;
L:      c[m]:=-c[m];
            s:=j
            end lab[v]=k1
        end dfs;
        for i:=1 step 1 until n do
            num[i]:=0;
        i:=1:=m:=s:=0;
        for j:=1 step 1 until n do

```

```

    if num[j]=0
      then dfs(j)
    and strongconnect;
comment (3) Step 1. Finding strongly connected
  components of D;
f:=true;
strongconnect(l,c);
if l=1
  then
    begin
      f:=false;
      go to FIN
    end l=1
  else
    begin
      integer k,h,h1,r1,v,w,w1,z;
      integer array a,b[1:1],nrc[0:1];
      Boolean array now[1:1,1:1];
      comment (4) Step 2. Computation of the adja-
        cency matrix now[1:1,1:1] of the condensation
        D* of D;
      for i:=1 step 1 until l do
        for j:=1 step 1 until l do
          now[i,j]:=false;
      nrc[0]:=j:=0;
      for i:=1 step 1 until n do
        if c[i]<0
          then
            begin
              j:=j+1;

```

```

    nrc[j]:=i;
    c[i]:=-c[i]
  end i;
for i:=1 step 1 until 1 do
  begin
    r1:=nrc[i];
    s:=nrc[i-1]+1;
    m:=i-1;
    for j:=1 step 1 until m,i+1 step 1 until 1 do
      begin
        h1:=nrc[j];
        k:=nrc[j-1]+1;
        for z:=s step 1 until r1 do
          begin
            w1:=nrc[c[z]];
            for w:=nrc[c[z]-1]+1 step 1 until w1 do
              begin
                v:=p[w];
                for h:=k step 1 until h1 do
                  if v=c[h]
                    then
                      begin
                        now[i,j]:=true;
                        go to H.
                      end h
                    end w
                  end z;
          H:   end j
                end i;
  comment (5) Step 3. Computation of the linear

```

```

ordering a[1:l] of vertices of  $D^*$  ;
for i:=1 step 1 until l do
begin
  s:=0;
  for j:=1 step 1 until l do
    if now[j,i]
      then s:=s+1;
  b[i]:=s;
  a[i]:=i
and i;
for k:=1 step 1 until l do
begin
  for h:=k step 1 until l do
begin
  j:=a[h];
  if b[j]=0
    then
begin
  a[h]:=a[k];
  a[k]:=j;
  for i:=k+1 step 1 until l do
begin
  s:=a[i];
  if now[j,s]
    then b[s]:=b[s]-1
and i;
  go to K
end b[j]=0
end h;
K: and k;

```

```

comment (6) Step 4. Computation of the permutation np[1:n] from the linear ordering a[1:l] and from array c[1:n] containing vertex numbers of consecutive strongly connected components of D;
m:=0;
for j:=1 step 1 until l do
  begin
    k:=nrc[a[j]-1]+1;
    h:=nrc[a[j]];
    for i:=k step 1 until h do
      begin
        m:=m+1;
        np[m]:=c[i]
      end i
    end j
  end;
FIN:
end matrixpermp

```

Step 2. Find the condensation D^* of D .

Step 3. Find the linear ordering of vertices of \bar{D} . The method of Marimont (see [9] and [10]) has been used in this step.

Step 4. Relabel the vertices of the consecutive strongly connected components of D using the ordering found in Step 3.

Step 1 and Steps 2-4 of procedure *matrixpermp* need $O(m)$ and $O(l^2 + m)$ operations, respectively, where m and l are the numbers of arcs and the strongly connected components of the digraph associated with a given matrix, respectively. The space which is used by the procedure is bounded by $4n + 3l + l^2 + c$, where c is a constant which does not depend on data.

3.2. Procedure *matrixpermpq2*. Procedure *matrixpermpq2* reduces a matrix A to form (2). It is assumed that A is a non-singular matrix since problems (i) and (ii) which can be simplified if A is reducible to form (2) are trivial in the opposite case.

```

procedure matrixpermpq2(n,p,nrp,f,np,nq);
  value n;
  integer n;
  Boolean f;
  comment (1) The procedure finds the permutation
    matrices P and Q which reduce a given matrix
    A to the block triangular form (2);
  integer array p,nrp,np,nq;
  begin
    integer i,j,k,l,ll,l1,l2,m,m1,s;
    Boolean ff,ad;
    integer array c,k,r,sol[1:n];
    comment (2) The declaration of procedure ma-
      trixpermp is to be inserted in this place.
      The procedure matrixpermp is a modification
      of procedure matrixpermp consisting in ex-
      changing the 40-th and the 135-th rows of it
      to k:=nrp[v]-1 and w1:=nrp[c[z]]-1,resp.;
    comment (3) Steps 1 and 2. Determination of
      a maximal transversal of matrix A and trans-
      formation of A to AR;
    f:=true;
    for j:=1 step 1 until n do
      k[j]:=sol[j]:=0;
    l:=0;
    m1:=-n-1;
    for i:=1 step 1 until n do
      begin
        for j:=1 step 1 until n do
          begin

```

```

12:=nrp[i];
for l1:=nrp[i-1]+1 step 1 until 12 do
  begin
    l1:=p[l1];
    if l1>j
      then
        begin
          ad:=l1=j;
          go to FD1
        end
      end l1;
    ad:=false;
FD1: if ad
      then
        begin
          if sol[j]=0
            then
              begin
                sol[j]:=i;
                l:=l+1;
                r[i]:=0;
                go to NEXTI
              end sol[j]=0
            end ad
          end j;
        r[i]:=m1;
NEXTI:
        end i;
    if l=n
      then go to FUN;

```

ITER:

```

for i:=1 step 1 until n do
  begin
    k1:=r[i];
    if k1<0
      then
        begin
          r[i]:=-k1;
          for j:=1 step 1 until n do
            if k[j]=0
              then
                begin
                  l2:=nrp[i];
                  for l1:=nrp[i-1]+1 step 1 until l2 do
                    begin
                      l1:=p[l1];
                      if l1>j
                        then
                          begin
                            ad:=l1=j;
                            go to FD2
                          end
                        end l1;
                    ad:=false;

```

FD2:

```

if ad
  then
    begin
      if sol[j]=0
        then go to EX;
      k[j]:=-i;

```

```

        ff:=true
      end ad
    end j
  end k1<0
end i;
if ff
  then
    begin
      for j:=1 step 1 until n do
        begin
          k1:=k[j];
          if k1<0
            then
              begin
                k[j]:=-k1;
                r[sol[j]]:=-j;
                ff:=false
              end k1<0
            end j
          end ff
        else go to FUN;
      go to if ff then FUN else ITER;

```

EX:

```

for sol[j]:=i while r[i]≤n do
  begin
    j:=abs(r[i]);
    i:=k[j]
  end sol[j];
r[i]:=0;
l:=l+1;

```

```

if l=n
  then go to FUN1;
for i:=1 step 1 until n do
  r[i]:=if r[i]<a then 0 else m1;
for j:=1 step 1 until n do
  k[j]:=0;
go to ITER;
FUN:
  if l<n
    then
      begin
        f:=false;
        go to FIN
      end;
FUN1:
  for i:=1 step 1 until n do
    r[sol[i]]:=i;
  for i:=1 step 1 until n do
    begin
      l2:=nrp[i];
      for j:=nrp[i-1]+1 step 1 until l2 do
        if p[j]=r[i]
          then
            begin
              for l1:=j+1 step 1 until l2 do
                p[l1-1]:=p[l1];
              go to EP
            end j;
    end i;
EP:
  l:=nrp[n];

```

```

for i:=1 step 1 until 1 do
  p[i]:=sol[p[i]];
comment (4) Step 3. Computation of the permutation np;
matrixpermp(n, p, nrp, f, np);
comment (5) Computation of the permutation nq;
if f
  then
    for i:=1 step 1 until n do
      nq[i]:=r[np[i]];
FIN;
end matrixpermpq2

```

Let B be the bipartite digraph associated with A such that the set of vertices is $S \cup T = \{s_1, s_2, \dots, s_n\} \cup \{t_1, t_2, \dots, t_n\}$ and a pair (s_i, t_j) is an arc of B if and only if $a_{ij} \neq 0$.

Reduction (2) of A is related to the reduction of the bipartite digraph associated with A (see [1]-[3] and [8] for details).

If a matrix A is non-singular, then the reduction PAQ is in fact carried out by two steps $P(AR)P^{-1}$, where R is a permutation matrix such that the matrix AR has non-zero diagonal elements, hence $Q = RP^{-1}$ (see [2]).

The algorithm for finding the permutation matrices P and Q reducing A to form (2) is as follows.

Step 1. Find a maximal transversal of B , i.e., a maximal number of non-zero elements of A such that no two of them belong to the same row or to the same column of A . The algorithm of Ford and Fulkerson has been used in this step (see [5] and [9]).

If a maximal transversal has cardinality less than n , then the matrix A cannot be reduced to form (2). The matrix A is singular in this case.

Step 2. Find AR , i.e., permute the columns of A until the elements of the maximal transversal occupy the main diagonal.

Step 3. Apply procedure *matrixpermp* to the matrix AR .

Procedure *matrixpermpq2* needs $O(n^3)$ and $O(m)$ operations in Step 1 and Step 2, respectively, and the space is bounded by $4n$ in these two steps. Time and space complexity of Step 3 has been evaluated above.

```

procedure matrixpermpq3(n,p,nrp,f,np,nq);
  value n;
  integer n;
  Boolean f;
  integer array p,nrp,np,nq;
  comment (1) The procedure finds the permutation
    matrices P and Q which decompose a given matrix
    A to the block diagonal form (1);
  begin
    integer i,k,l,m;
    k:=m:=0;
    for i:=1 step 1 until n do
      begin
        l:=nrp[i];
        k:=l-k;
        m:=m+k*(k-1);
        k:=l
      end i;
    if m=0
      then
        begin
          f:=false;
          go to fin
        end m=0;
    k:=n*(n-1);
    if m>k
      then m:=k;
    begin
      integer i1,j,j1,l,l1;
      integer array cn,cnb,ncv,np1[1:n],nrp1[0:n],p1[1:m];

```

```

integer procedure conrec(p1,nrp1,cn,cv,ncv);
integer array p1,nrp1,cn,cv,ncv;
comment (2) The procedure conrec is a realization
of Tarjan's method [14] for finding the
connected components of the simple graph G
associated with A. The structure of G is stored
in arrays p1[0:m] and nrp1[0:n], where
 $m = \min(n \times (n-1), (d[1] \times (d[1]-1) + \dots + d[n] \times (d[n]-1)))$ 
and d[i] is the number of non-zero
elements in the i-th row of A;
begin
integer f,g,j,l;
integer array number[1:n];
procedure dfs(v);
integer v;
begin
integer i,i1,w;
l:=number[v]:=l+1;
cn[v]:=g;
f:=f+1;
cv[l]:=v;
i1:=nrp1[v];
for i:=nrp1[v-1]+1 step 1 until i1 do
begin
w:=p1[i];
if number[w]=0
then dfs(w)
end i;
end dfs;
g:=l:=0;

```

```

for j:=1 step 1 until n do
  number[j]:=0;
for j:=1 step 1 until n do
  if number[j]=0
    then
      begin
        f:=0;
        g:=g+1;
        dfs(j);
        ncv[g]:=f
      end j;
  conrec:=g
end conrec;
comment (3) Finding the elements of arrays p1
and nrp1 (see comment (2));
nrp1[0]:=m:=0;
for k:=1 step 1 until n do
  begin
    l:=k-1;
    for j:=1 step 1 until l,k+1 step 1 until n do
      begin
        for i:=1 step 1 until n do
          begin
            l1:=nrp[i];
            for i1:=nrp[i-1]+1 step 1 until l1 do
              if p[i1]≥k
                then
                  begin
                    if p[i1]≠k
                      then go to FD2

```

```

    else
    for j1:=nrp[i-1]+1 step 1 until l1 do
    if p[j1]≥j
    then
    begin
    if p[j1]=j
    then
    begin
    m:=m+1;
    p1[m]:=j;
    go to FD3
    end p[j1]=j
    else go to FD2
    end p[j1]≥j
    end i1;
FD2:   end i;
FD3:   end j;
    nrp1[k]:=m
    end k;
    comment (4) Computation of the permutation nq;
    k:=conrec(p1,nrp1,cn,nq,ncv);
    comment (5) Computation of the permutation np;
    if k=1
    then
    begin
    f:=false;
    go to fin
    end k=1
    else f:=true;
    for i:=1 step 1 until n do

```

```

    np[i]:=np1[i]:=0;
l:=0;
for i:=1 step 1 until k do
    begin
        cnb[i]:=l+1;
        l:=l+ncv[i]
    end i;
j:=1;
for i:=1 step 1 until n do
    begin
        j1:=nrp[i];
        if j1>=j
            then
                begin
                    np1[i]:=1;
                    l:=cn[p[j]];
                    k:=cnb[l];
                    np[k]:=1;
                    cnb[l]:=k+1
                end j1>=j;
        j:=j1+1
    end i;
j:=1;
for i:=1 step 1 until n do
    if np1[i]=0
        then
            begin
                for j:=j step 1 until n do
                    if np[j]=0
                        then

```

```

begin
  np[j]:=i;
  go to nexti
end j;
nexti:
  end i
end;
fin:
  end matrixpermpq3

```

3.3. Procedure *matrixpermpq3*. Procedure *matrixpermpq3* finds the permutation matrices P and Q which decompose a given matrix A to the block diagonal form (1).

Let G denote the digraph associated with A whose vertices correspond to columns of A and two vertices are adjacent if there exists at least one row of A having non-zero elements in both of the columns. Let

$$C = A^T * A = \bigcup_{k=1}^n a_{ki} \cap a_{kj},$$

where A is regarded as a Boolean matrix. It is easily seen that C is the adjacency matrix of G , i.e., (i, j) is an arc of G if and only if $c_{ij} \neq 0$. C is a symmetric matrix so that G is a symmetric digraph (i.e., simple graph).

It is easy to prove the following lemma (see also [7] and [15]).

LEMMA 4. (a) *Vertices of G (i.e., columns of A) which belong to a particular diagonal block are connected by paths of length n or less with each other, i.e., a partition of columns of A into diagonal block submatrices is determined uniquely by the partition of vertices of G into connected components.*

(b) *If $a_{ij} = 1$, then the i -th row of A belongs to the diagonal block containing the j -th column of A .*

The main steps of the algorithm are the following:

Step 1. Find the connected components of G . The depth-first search technique has been used in this step.

Step 2. Order columns of A according to the partition obtained in Step 1.

Step 3. Order rows of A (see Lemma 4 (b)).

The algorithm has the running time bounded by $O(n^3)$ and the space bounded by

$$6n + \min \left\{ n^2, \sum_{i=1}^n d_i(d_i - 1) \right\} + c,$$

where d_i ($i = 1, 2, \dots, n$) is the number of non-zero elements in the i -th row of A .

4. DATA AND RESULTS

Data are the same for all procedures.

n — dimension of a matrix A ;
 $p[1:m], nrp[0:n]$ — these two arrays are the list representation of the matrix A , i.e., m is the number of non-zero elements of A and the column numbers of non-zero elements belonging to the row k are located in the increasing order in $p[nrp[k-1] + 1:nrp[k]]$; we assume that $nrp[0] = 0$ and one can see that $m = nrp[n]$.

Results:

f — Boolean variable which has the value **true** if the matrix A can be transformed and **false** otherwise;
 $np[1:n]$ — integer array such that $P = (e_{i_1}, e_{i_2}, \dots, e_{i_n})^T$, where $i_j = np[j]$ and e_i denotes the i -th unit vector;
 $nq[1:n]$ — integer array such that $Q = (e_{j_1}, e_{j_2}, \dots, e_{j_n})$, where $j_l = nq[l]$.

5. EXAMPLES AND REMARKS

Example 1.

$$A_1 = \begin{bmatrix} 0 & 0 & 1 & 1 & 1 & 0 \\ 0 & 0 & 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 1 \\ 1 & 1 & 1 & 0 & 1 & 1 \\ 1 & 1 & 0 & 1 & 0 & 1 \\ 0 & 0 & 1 & 0 & 0 & 0 \end{bmatrix}.$$

The matrix A_1 can be reduced to form (4) by procedure *matrixperm* using

$$P_1 = (e_5, e_4, e_1, e_2, e_6, e_3)^T.$$

Thus

$$P_1 A_1 P_1^{-1} = \left[\begin{array}{ccc|ccc} 0 & 1 & 1 & 1 & 1 & 0 \\ 1 & 0 & 1 & 1 & 1 & 1 \\ 1 & 1 & 0 & 0 & 0 & 1 \\ \hline & & & 0 & 0 & 1 \\ & 0 & & & 0 & 1 \\ & & & & & 1 \\ \hline & & & & & 1 & 0 \end{array} \right].$$

Notice that procedure *matrixpermpq2* applied to the matrix A_1 fails to find this reduction. Generally, procedure *matrixpermpq2* is not a relaxation of procedure *matrixpermp*.

Example 2.

$$A_2 = \begin{bmatrix} 0 & 1 & 1 & 1 \\ 1 & 0 & 1 & 0 \\ 0 & 0 & 1 & 1 \\ 1 & 0 & 1 & 0 \end{bmatrix}.$$

The digraph corresponding to the matrix A_2 is strongly connected. Hence, for no permutation P does PA_2P^{-1} reduce. Using procedure *matrixpermpq2* we obtain permutation matrices

$$R_2 = (e_2, e_1, e_4, e_3) \quad \text{and} \quad P_2 = (e_1, e_3, e_2, e_4)^T,$$

and hence $Q_2 = (e_2, e_4, e_1, e_3)$. Finally,

$$P_2 A_2 Q_2 = \left[\begin{array}{ccc|cc} 1 & 1 & 0 & 1 \\ 0 & 1 & 0 & 1 \\ \hline 0 & 0 & 1 & 1 \\ 0 & 0 & 1 & 1 \end{array} \right].$$

Example 3.

$$A_3 = \begin{bmatrix} 0 & 1 & 0 & 0 \\ 1 & 0 & 0 & 1 \\ 1 & 0 & 0 & 1 \\ 0 & 0 & 1 & 0 \end{bmatrix}.$$

Despite $\det(A_3) = 0$, the matrix A_3 has the maximal transversal of cardinality 4. In fact, procedure *matrixpermpq2* can reduce any matrix A which satisfies $\text{per}(A) \neq 0$, where per denotes the (+)-determinant (permanent) of a matrix.

For the matrix A_3 , procedure *matrixpermpq2* finds

$$P_3 = (e_1, e_3, e_2, e_4)^T, \quad Q_3 = (e_2, e_4, e_1, e_3),$$

and

$$P_3 A_3 Q_3 = \left[\begin{array}{c|cc|c} 1 & 0 & 0 & 0 \\ \hline 0 & 1 & 1 & 0 \\ 0 & 1 & 1 & 0 \\ \hline 0 & 0 & 0 & 1 \end{array} \right].$$

The same result can be obtained by applying procedure *matrixpermpq3* to the matrix A_3 .

Example 4.

$$A_4 = \begin{bmatrix} A_1 & 0 \\ 0 & A_3 \end{bmatrix}.$$

The matrix A_1 can be reduced by using procedure *matrixpermp*, and the matrix A_3 can be reduced by using procedure *matrixpermpq2* and decomposed by using *matrixpermpq3*.

Procedure *matrixpermp* reduces A_4 to the form

$$\begin{bmatrix} P_1 A_1 P_1^{-1} & 0 \\ 0 & A_3 \end{bmatrix},$$

and procedure *matrixpermpq3* decomposes A_4 to the form

$$\begin{bmatrix} A_1 & 0 \\ 0 & P_3 A_3 Q_3 \end{bmatrix},$$

however procedure *matrixpermpq2* fails.

Notice that reduction of form (2) can be found by using procedure *matrixpermpq2* to submatrices A_1 and A_3 .

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ALGORYTMY 62-64

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TRANSFORMACJE MACIERZY RZADKICH METODAMI TEORII GRAFÓW

STRESZCZENIE

Praca zawiera opisy trzech algorytmów dla transformacji kwadratowej macierzy rzadkiej do diagonalnej lub górnej trójkątnej postaci blokowej przy użyciu tylko permutacji wierszy i kolumn. Zredukowane w ten sposób macierze pozwalają zmniejszyć wymiary wielu problemów analizy numerycznej, jak np. obliczanie wartości wyznacznika, odwracanie macierzy, obliczanie wartości własnych oraz rozwiązywanie układów równań liniowych. Podstawowe kroki algorytmów mają swoje uzasadnienie na gruncie teorii grafów.

Dane (jednakowe dla wszystkich procedur):

n — wymiar macierzy A ;
 $p[1:m], nrp[0:n]$ — tablice zawierające listową reprezentację macierzy A , tzn. m jest liczbą niezerowych elementów macierzy A , a numery kolumn, w których znajdują się niezerowe elementy k -tego wiersza, umieszczone są w rosnącym porządku w $p[nrp[k-1]+1:nrp[k]]$; zakładamy, że $nrp[0] = 0$, i widać, że $m = nrp[n]$.

Wyniki:

f — zmienna boolowska, która przyjmuje wartość **true**, jeśli istnieje odpowiednia transformacja macierzy A , wartość **false** zaś w przeciwnym razie;
 $np[1:n]$ — tablica całkowita taka, że $P = (e_{i_1}, e_{i_2}, \dots, e_{i_n})^T$, gdzie $i_j = np[j]$, a e_i oznacza i -ty wektor jednostkowy;
 $nq[1:n]$ — tablica całkowita taka, że $Q = (e_{j_1}, e_{j_2}, \dots, e_{j_n})$, gdzie $j_l = nq[l]$.