

Algorithm 96

A LINEAR EQUATION SOLVER FOR GALERKIN AND LEAST SQUARES METHODS

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Author's Notes

The asymmetric or modified Galerkin method for the solution of a linear operator equation

$$\mathcal{L}f = g \quad (1)$$

in an inner product space, proceeds by setting

$$f \approx f_N = \sum_{i=1}^N a_i h_i \quad (2)$$

and computing $\mathbf{a} = (a_i)$ from the Galerkin equation

$$\mathbf{L}\mathbf{a} = \mathbf{g} \quad (3)$$

where

$$L_{ij} = (h_i', \mathcal{L}h_j); g_i = (h_i', g)$$

and $\{h_i\}$, $\{h_i'\}$ are 'suitably chosen' sequences of functions. The symmetric Galerkin technique chooses $\{h_i'\} = \{h_i\}$; the method of least squares follows from the choice $\{h_i'\} = \{\mathcal{L}h_i\}$. Such calculations are common in approximation theory problems ($\mathcal{L} = I$) and in the fields of differential and integral equations; it is therefore desirable to have efficient solution methods for the resulting linear equations. For a wide class of one-dimensional differential and integral equation problems, it has been shown (Freeman, Delves and Reid, 1974; Bain and Delves, 1977; Delves, 1974) that the use of orthogonal basis functions leads to matrices with a structure referred to as 'Asymptotic diagonality' (Delves, 1977). In Delves (1977), a block iterative algorithm was described for matrices with such a structure; the convergence rate of this algorithm is independent of N , giving a solution time of $\mathcal{O}(N^2)$; if all such problems led to such matrices, this algorithm would therefore be preferred to a direct solution. Unfortunately, this is not so; expansion methods with non-orthogonalised bases may lead to very ill-conditioned matrices. For example, the ill-conditioning of the least squares method with basis $\{1, x, x^2, \dots\}$ is notorious, and for this reason least squares problems are usually discretised and solved as a set of overdetermined equations, the (normal) equations (3) never being formed. Recently, however, Barrodale and Stuart (1977) have introduced a new version of Gauss elimination with particular advantages for the solution of ill-conditioned expansion problems. In this variant, which uses both row and column pivoting, the unknowns yielding the largest residual are eliminated first, and a sensible solution to the approximation problem can be returned even if the matrix proves to be numerically singular.

We give here an implementation of the iterative scheme of Delves (1977) which maintains the advantages of the Barrodale algorithm and which can therefore be used for both well-conditioned and ill-conditioned problems.

The algorithm

The iterative scheme of (2) requires that the first M equations be partitioned off and solved directly with the current values of the remaining unknowns on the right hand side; a straightforward Gauss-Seidel scheme is used for the $N-M$ additional equations. The value of M required depends on the matrix to be solved. In the algorithm given below, an initial sweep of the matrix is performed to choose an appropriate value of M ; the $M \times M$ leading submatrix is triangulated using Gauss elimination, and the convergence of the iterations is then monitored. If convergence is too slow, or non-existent, the value of M is increased. Eventual convergence is there-

fore guaranteed for any matrix; if the problem proves well-conditioned, the time taken will be $\mathcal{O}(N^2)$, while if it is sufficiently ill-conditioned, the algorithm will eventually set $M = N$ and perform a direct solution of the problem.

The Gauss elimination routine used for the direct solution, employs the pivoting strategy of Barrodale and Stuart (1977), and is arranged to process additional rows and columns (if M is increased) and right hand sides (as the iterations proceed). For a well-conditioned approximation problem of significant size, M will be much less than N ; experience to date indicates that the initial estimate of M is increased only rarely. If the matrix proves ill-conditioned, the routine may set $M = N$. If in this case the matrix is found after Q elimination stages to be numerically singular, the remaining $N-Q$ unknowns are set to zero and a solution of the Q -term approximation problem returned, with a warning flag; note that the zero elements may not be the last few, due to the column pivoting employed. A singular matrix with $M < N$ merely results in M being increased and the triangulation restarted. Full iterative refinement with double length accumulation of the residuals is provided as an option for users with ill-conditioned problems of a type for which this is appropriate.

The routine returns a structure containing:

- (a) The solution vector
- (b) An estimate of the accuracy achieved
- (c) The value of M used by the routine
- (d) An error flag set to **false** if with $M = N$ the matrix was found to be numerically singular.

In this case the value of M returned is not N , but Q , the number of significant, nonzero entries in the solution vector and the numerical rank of the input matrix.

If on output $M = N$ and no iterative refinement has been called for, the error estimate will not be meaningful.

One other aspect of the algorithm is perhaps worthy of comment; this is the use of matrix operators $*$, $+$, $-$ to multiply a matrix by a vector, and to add or subtract two vectors. In practice these will normally be available through a standard installation library prelude, and would then be machine coded. In the timings which follow we consider three versions of the algorithms:

Version A: As given here, with matrix operators coded in ALGOL 68

Version B: As given here, but using machine coded matrix operators

Version C: A rewritten version with the operator calls removed and replaced by in-line ALGOL 68 code.

Code for the matrix operators is not included here.

Performance

Table 1 shows some timings obtained from the algorithm on an ICL 1906S computer. The equations solved are those arising from a Galerkin solution of the Fredholm integral equation (see, e.g. Delves, 1974)

$$f(x) = g(x) + \lambda \int_0^1 e^{\beta xy} f(y) dy \quad (4)$$

with

$$g(x) = e^{ax} - \lambda [e^{a+\beta x} - 1]/[\alpha + \beta x] \quad (5)$$

and exact solution $f(x) = e^{ax}$. The expansion set used are the translated Chebychev polynomials; these lead to an asymptotically diagonal matrix L for all values of the parameter β , although the condition number of the matrix increases with $|\beta|$. In Table 1, values of $\beta = 1, 5, 20$ are taken, with $\lambda = \alpha = 1$. For each value of β , four sets of times are given. The first is that for a standard Gauss elimination routine (NAG library routine FO4AJB) using row interchanges, displayed for comparison purposes; the other three

Table 1 Solution of the linear equations arising from the integral equation (4)

All times are in msec and were obtained on an ICL 1906S using the RRE ALGOL 68R compiler

The versions of the routine are as follows:

- Version A As given here; matrix operators coded in ALGOL 68
- Version B As given here; matrix operators machine coded (partially)
- Version C Routine rewritten to replace matrix operator calls by inline (ALGOL 68) code

	$N =$	5	9	17	33	65
Routine FO4AJB (Gauss Elimination)	$T =$	15	36	125	616	3,780
$\beta = 1;$	$M =$	3	3	3	3	3
Version A	$T =$	63	56	79	189	509
Version B	$T =$	59	51	68	137	320
Version C	$T =$	35	40	66	184	621
$\beta = 5;$	$M =$	5	8	10	15	15
Version A	$T =$	19	48	117	195	726
Version B	$T =$	18	44	101	144	443
Version C	$T =$	16	36	95	191	871
$\beta = 20;$	$M =$	5	9	17	22	22
Version A	$T =$	19	58	170	783	1,094
Version B	$T =$	19	53	128	630	745
Version C	$T =$	17	52	156	720	1,202

relate to the three versions A, B, C of the algorithm as described above.

These timings show, first, the $\mathcal{O}(N^2)$ cost of the iterative algorithm, in contrast to the $\mathcal{O}(N^3)$ dependence of the standard Gauss elimination routine. The differences between versions A, B, and C show that the extra overheads of calling the matrix operators are negligible; the easy availability of the machine coded versions of these operators, and the substantial improvement which these yield, for the larger matrices, indicates that their use increases the efficiency as well as the clarity of the code.

Acknowledgement

I am grateful to Dr A. Hinxman for providing the machine code version of the matrix operators used to obtain timings for version B, and to D. Yates, J. M. Watt and M. A. Hennell for discussions of this work in general, and of operator packages in particular.

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MODE MATRESULT =
STRUCT ( REF [, ] REAL ans, REAL ep, INT evals, BOOL fin);
PROC lequad =
( REF [, ] REAL a, b, x, REAL acc, BOOL refine) MATRESULT :
BEGIN
#solves the linear equations a*x=b for multiple righthand sides b[,i]#
#by a block iterative method.For a suitable value of m,the matrix a #
#is partitioned.The first m equations are solved directly,and the #
#remainder solved using a Gauss-Seidel scheme.The value of m is #
#chosen to ensure rapid convergence of the iterations. #
# For wellconditioned approximation problems,the solution time for #
#n equations is o(n^2).For sufficiently illconditioned problems,the #
#method reduces to a direct solution using the pivoting strategy of #
#Barrodale (see List of references). #
# Parameters #
# a - a [1:n,1:n] REAL matrix of coefficients. #
# Left unchanged by the procedure. #

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# b - a [1:n,1:nrhs] matrix containing as its columns the #
# nrhs righthand sides for which solutions are required. #
# Left unchanged by the procedure. #
# x - a [1:n,1:nrhs]matrix containing on entry an initial #
# approximation to the solution vectors.If no information #
# is available,this approximation may be zero. #
# On exit, x will contain the computed solution. #
# acc - a user -provided estimate of the accuracy required. #
# The procedure will attempt to return an approximation #
# xcalc to the exact solution x such that #
# //x-xcalc// < acc. #
# refine- if set to TRUE on entry,the procedure carries out #
# double-length evaluation of the residuals,and iterative #
# refinement of the solution of the first m equations. #
# result #
# The routine returns the calculated solution together #
# with an error estimate,in a MATRESULT structure. #
# The fields of this structure have the following #
# significance: #
# ans - a [1:n,1:nrhs] REAL array containing the solution xcalc #
# ep - an estimate of the infinity norm //xcalc-x// #
# evals - normally contains the value of m,the size used for the #
# first block of equations.A large value of m indicates #
# illconditioning in the matrix. #
# If the matrix a was found to be numerically singular, #
# then evals contains instead the numerical rank r of a. #
# In this case,n-r of the rows of xcalc will be found to be #
# identically zero(these may not be the last rows),and the #
# remaining r rows solve the reduced r*r problem. #
# fin - a boolean value normally set to TRUE ; #
# set to FALSE if a is found to be numerically singular. #
# operators. #
# The procedure assumes that the following matrix operators #
# have been defined: #
# NORM a -gives the infinity norm of a #
# NORM1 a-gives the one norm of a #
# +=,-,=,/,=,* : with their usual meanings. #
# D* , D-:= :double length versions of *,- := #
#-----#
INT n := 1 UPB a, m := 0, limit, rank, nrhs := 2 UPB b;
BOOL rowexchange = TRUE , colexchange = FALSE ;
BOOL notconverged, converging;
REF [, ] REAL null = NIL;
REAL cutoff := 0.1, del1 := 1.1# used by setn #;
PROC interchange =
( REF [, ] REAL a, INT r, s, BOOL row) VOID :
BEGIN # interchanges two columns or rows of a #
INT l;
IF r/=s
THEN
REF [, ] REAL b, c;
IF row
THEN b := a[s, ]; c := a[r, ]; l := 2
ELSE b := a[, s]; c := a[, r]; l := 1
FI ;
[l LWB a:l UPB a] REAL d;
d := c;
c[l] := b[l];
b[l] := d
FI
END # interchange #;
PROC maxind = ( REF [, ] REAL a) INT :
BEGIN
# returns a pointer to the element of maximum size in a #
INT m;
REAL temp := 0.0, temp;
m := LWB a;
FOR i FROM LWB a TO UPB a
DO

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temp := ABS a[i];
IF temp>temp THEN temp := temp; m := i FI
OD ;
m
END # maxind #;
PROC leqdirect =
( REF [ , ] REAL a, b, REF [ ] INT row, col, REF INT mprev
) BOOL
;
# Gives a direct solution of the m equations a*x=b,using Gauss #
# elimination,given that mprev rows and columns of a have already #
# been processed.The vectors row,col hold on entry pivoting #
# information for these first mprev equations,and on exit similar #
# information for the remaining equations also.The vector b is #
# overwritten by the solution x. #
# If a proves to have numerical rank r<m,the last(before #
# reordering)m-r rows of b are set zero,and a solution of the #
# remaining r equations returned,together with the value TRUE #
# for leqdirect. #
BEGIN
INT rowi, colj, m := UPB a;
REAL delta := 10*smallreal, temp, mult;
BOOL sing := FALSE, banded := mprev<m;
INT piv;
rank := m# initial assumption #;
# treat first mprev rhsides and new columns #
FOR newrow TO mprev
DO
interchange(b, newrow, row[newrow], rowexchange);
IF banded
THEN
interchange(a[, mprev+1:m], newrow,
row[newrow], rowexchange);
interchange(a[mprev+1:m, ], newrow,
col[newrow], colexchange)
FI ;
temp := a[newrow, newrow];
FOR i FROM newrow+1 TO m
DO
mult := a[i, newrow]/temp;
IF ABS mult>smallreal
THEN
b[i, ]:=mult*b[newrow, ];
IF banded
THEN
limit :=
IF i>mprev
THEN newrow
ELSE mprev
FI +1;
a[i, limit:m]-:=mult*a[newrow, limit:m]
FI
OD # i #
OD # newrow #;
# now complete the processing of the new rows #
FOR newrow
FROM IF mprev=0 THEN 1 ELSE mprev FI
TO m
DO
# pick a row pivot #
row[newrow] := piv :=
maxind(b[newrow:m AT newrow, 1]);
interchange(b, newrow, piv, rowexchange);
interchange(a[, newrow:m], newrow, piv, rowexchange
);
# pick a column pivot #
col[newrow] := piv :=
maxind(a[newrow, newrow:m AT newrow]);
interchange(a, newrow, piv, colexchange);
temp := a[newrow, newrow];
IF ABS temp<delta
THEN
sing := TRUE ;
rank := newrow-1;
CLEAR b[rank+1:m, ];
GOTO backsub
FI ;
FOR i FROM newrow+1 TO m
DO
mult := a[i, newrow]/temp;
a[i, newrow+1:m]-:=mult*a[newrow, newrow+1:m];
b[i, ]:=mult*b[newrow, ]
OD # i #
OD # newrow #;
# now back substitute #
backsub: b[rank, ]:=a[rank, rank];
FOR i FROM rank-1 BY -1 TO 1
DO (b[i, ]:=a[i, i+1:rank]*b[i+1:rank, ])/:=a[i, i]
OD ;
# now resort #
FOR i FROM m-1 BY -1 TO 1
DO interchange(b, i, col[i], rowexchange)
OD ;
mprev := m;
sing
END # leqdirect #;
PROC setm = ( INT mold) INT ;
# computes a suitable value for m,the point at which the
matrix a is partitioned #
BEGIN
REAL temp, sum;
INT m := mold;
IF m=0
THEN
# check the bottom rows #
m := n;
FOR i FROM n BY -1 TO 2
WHILE
((temp := ABS a[i, i])/=0.0) AND
((sum := NORM1 a[i, ])<delta*temp)
DO m--:=1
OD
FI ;
# now check the sides #
IF m NE n
THEN
REAL anorm := 0.0;
FOR i TO m DO anorm+:= NORM1 a[i, ] OD ;
anorm:=cutoff;
FOR i

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WHILE (i<m AND m<n)
DO
sum := 0.0;
FOR j FROM n BY -1 TO m+1
WHILE
(
IF sum>anorm THEN m := j FI ;
sum<=anorm
)
DO sum+:= ABS a[i, j]
OD
OD ;
SKIP
FI ;
# if we are close to n,the hell with iterating #
IF (m/n)>0.8 THEN m := n FI ;
# force m>mold by a reasonable margin #
m := ( ROUND (1.2*mold)) MAX m;
# check that this is not too much #
m := m MIN n;
m
END # setm #;
PROC leqiter =
( REF [ , ] REAL adold, REF [ ] INT rowold, colold)
MATRESULT
;
# This is the main routine of leqwad, and implements the block #
# iterative scheme described in the text.An estimate of the current #
# accuracy is obtained from e(n)=||x(n)-x(n-1)||.If the iterations #
# diverge,the blocksize m is increased and leqiter is called #
# recursively to generate increased temporary storage.This should #
# happen only rarely.Otherwise,the iterations are terminated when #
# either the predicted current error falls below the requested acc, #
# or e(n) begins to oscillate.Such oscillations cannot occur,for a #
# linear problem,in the absence of roundoff errors;they are taken to #
# be an indication that the maximum achievable accuracy has been #
# attained. #
BEGIN
INT mnew;
REAL eps := acc+1, epsprev := acc+2,
convergencefactor := 1;
REAL epp;
BOOL singular, oscillating := FALSE ;
# first update the value of m and get appropriate
workspace #
mnew := setm(m);
[1:mnew, 1:mnew] REAL ad;
[1:mnew, 1:nrhs] REAL xold;
[1:nrhs] REAL temp;
[1:mnew] INT row, col;
REF [ ] REAL xx;
# copy appropriate part of the matrix #
IF adold ISNT null
THEN
ad[1:m, 1:m] := adold;
row[1:m] := rowold;
col[1:m] := colold;
ad[1:m, m+1:mnew] := a[1:m, m+1:mnew]
ELSE m := 0
FI ;
ad[m+1:mnew, 1:mnew] := a[m+1:mnew, 1:mnew];
REF [ , ] REAL x0 = x[1:mnew, ], b0 = b[1:mnew, ];
notconverged := converging := TRUE ;
FOR iter
WHILE notconverged AND converging
DO
xold := x0;
x0 := b0;
IF refine
THEN x0 D-:= a[1:mnew, 1:n] D* x
ELSE
IF mnew<n
THEN x0-:=a[1:mnew, mnew+1:n]*x[mnew+1:n, ]
FI
FI # refine #;
singular := leqdirect(ad, x0, row, col, m);
# note that leqdirect sets m:=mnew #
# check the change in x0 #
epp := epsprev;
epsprev := eps;
IF refine
THEN eps := NORM1 x0; x0+=xold
ELSE eps := NORM1 (x0-xold)
FI ;
IF singular
THEN converging := FALSE
ELSE
IF m<n# usual case # OR refine
THEN
# now Gauss Seidel on the remaining
equations #
FOR i FROM m+1 TO n
DO
xx := x[i, ];
temp := xx;
(x[i, ] := b[i, ])-:=a[i, 1:i-1]*
x[1:i-1, ];
IF i<n
THEN xx-:=a[i, i+1:n]*x[i+1:n, ]
FI ;
xx/:=a[i, i];
eps := eps MAX ( NORM1 (xx-temp))
OD # i #;
IF iter>1
THEN
convergencefactor :=
(
converging :=
(epsprev-eps)>10*smallreal
! eps/(epsprev-eps)-
! 1.0
)
FI ;
convergencefactor :=
convergencefactor MIN 100.0;
IF iter>2
THEN
oscillating :=
(eps>=epsprev) AND (epsprev<=epp)
FI ;
notconverged :=

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(eps*convergencefactor>acc) AND
  ( NOT oscillating)
ELSE
  # m=n and no iterative refinement.dont trust
  the error estimate #
  eps := 0.0;
  notconverged := converging := FALSE
  FI # main loop #
  FI # singularity test #
  OD # iteration loop #;
  IF (notconverged) AND m<n
  THEN
    cutoff/:=100;
    IF singular
    THEN
      Leqiter( NIL , NIL , NIL )
      # restarts the triangulation #
    ELSE Leqiter(ad, row, col)
    FI
  ELSE
    (x, eps*convergencefactor,
     IF singular THEN rank ELSE m FI ,
     NOT singular)
  FI
  END # Leqiter #;
  # now the main call #
  Leqiter( NIL , NIL , NIL )
END # Leqwad #;

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Algorithm 97 THE FAST GALERKIN ALGORITHM FOR THE SOLUTION OF LINEAR FREDHOLM EQUATIONS

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Authors' notes

In a recent paper, Delves (1977) gave a 'Fast Galerkin' Algorithm for the solution of the linear Fredholm equation of the second kind:

$$f(x) = g(x) + \int_a^b K(x, y) f(y) dy \quad (1)$$

The algorithm described produces an approximate solution $f_N(x)$ of the form

$$f_N(x) = \sum_{i=0}^{N-1} A_i T_i(ax - \beta) \quad (2)$$

$$\alpha = (2/(b - a)), \beta = (a + b)/(b - a)$$

where $T_i(z)$, $-1 \leq z \leq 1$, is a Chebyshev polynomial of the first kind; and in addition an error estimate which takes account of both truncation errors (finite N) and quadrature errors (in the approximation of the integrals involved). The computational cost involved is $\mathcal{O}(N^2 \ln N)$, compared with the $\mathcal{O}(N^3)$ cost of previous Chebyshev schemes for (1) (Elliott, 1963; Scraton, 1969; El-Gendi, 1969; Watson, 1973; Miller and Symm, 1975).

We give here an implementation of the algorithm, referring to Delves (1977) for a description of the method and of the error estimate; and for timings obtained with the algorithm. The language used is ALGOL 68 as defined in the Revised Report (van Wijngaarden *et al.*, 1974) and the program makes use of an FFT procedure (proc FFT) of which only a dummy version is included here.

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PROC postconvert = ( REF [ ] REAL a, b ) VOID :
# Forms the vector b:=a*c, where c is the transformation matrix #
# referred to in the text of ref (1), equation (26) #
BEGIN
  INT n := UPB a, m2, suffix;
  REAL temp, t1;
  FOR s FROM LWB b TO UPB b
  DO
    temp := 0.0;
    b[s] := a[s];
    FOR m TO n
    DO
      m2 := 2*m;
      t1 := IF s+m2<=n THEN a[s+m2] ELSE 0.0 FI ;
      suffix := ABS (s-m2-1);
      IF suffix<n THEN t1:=a[suffix+1] FI ;
      IF t1/=0.0 THEN temp+=t1/(m2*m2-1) FI
    OD ;
    b[s]-:=temp
  OD
END # postconvert #;
PROC preconvert = ( REF [ ] REAL a, b ) VOID :
# Forms the vector b:=c*a, where c is the same matrix as in
postconvert #
(a[1] := 2.0; postconvert(a, b); a[1] := 2.0; b[1] := 2.0);
PROC Leqfred =
( REF [ ] REAL a, REF [ ] REAL b, x, REAL acc ) VECRESULT :
# Solves the equations (Iprime+a*c)*x=b by block iteration#
# where Iprime(1)=1, I>1:=0.5, I=1 #
# This procedure is adapted from proc leqwad, ref(2). #
# The iterative scheme(21) of ref (1) is used, and #
# The product a*c is not formed explicitly. #
BEGIN
  INT n := 1 UPB a, m := 0, limit, rank;
  BOOL rowexchange = TRUE , colexchange = FALSE ;
  BOOL notconverged, converging;
  REF [ ] REAL mult = NIL ;
  REAL cutoff := 0.02, del1 := 0.02# used by setm #;
  [1:n] REAL y # used as temporary storage to hold c*x #;
  PROC interchange =
( REF [ ] REAL a, INT r, s, BOOL row ) VOID :
  # Interchanges two rows or columns of the matrix a #
  INT l;
  IF r/=s
  THEN
    REF [ ] REAL b, c;
    IF row
    THEN b := a[s, ]; c := a[r, ]; l := 2
    ELSE b := a[, s]; c := a[, r]; l := 1
    FI ;
    [l LWB a:l UPB a] REAL d;
    d := c;
    c[] := b[];
    b[] := d
  FI
END # interchange #;
PROC maxind = ( REF [ ] REAL a ) INT :
  # Returns a pointer to the largest element in a #
  INT m := LWB a;
  REAL temp := 0.0, temp;
  FOR i FROM LWB a TO UPB a
  DO
    temp := ABS a[i];
    IF temp>temp THEN temp := temp; m := i FI
  OD ;
  m
END # maxind #;
PROC Leqdirect =
( REF [ ] REAL a, REF [ ] REAL b, REF [ ] INT row, col,
  ) BOOL :
# Gives a direct solution of the equations a*x=b. #
# The solution x is returned in b. #
# This procedure is a modification of proc leqdirect given #
# in ref(2), and differs in treating only a single rh side #
BEGIN
  INT rowi, colj, piv, m := UPB a;
  REAL delta := 10*small real, temp, mult;
  BOOL sing := FALSE , banded := mpreve<m;
  rank := m # initial assumption #;
  # treat first mpreve rhsides and new columns #
  FOR newrow TO mpreve
  DO
    interchange(b, newrow, row[newrow], colexchange);
    # note that algol68 treats b as a row vector, hence
    colexchange #
    IF banded
    THEN
      interchange(a[ , mpreve+1:m ], newrow,
        col[newrow], colexchange)
    FI ;
    temp := a[newrow, newrow];
    FOR i FROM newrow+1 TO m
    DO
      mult := a[i, newrow]/temp;
      IF ABS mult>smallreal
      THEN
        b[i]-:=mult*b[newrow];
        IF banded
        THEN
          limit :=
            IF i>mpreve
            THEN newrow
            ELSE mpreve
            FI +1;
          a[i, limit:m]-:=mult*a[newrow, limit:m]
        FI
      FI
    OD # i #
  OD # newrow #;
  # now complete the processing of the new rows #
  FOR newrow
  FROM IF mpreve=0 THEN 1 ELSE mpreve FI
  TO m
  DO
    # pick a row pivot #
    row[newrow] := piv :=
      maxind(b[newrow:m AT newrow]);

```

```

interchange(b, newrow, piv, colexchange);
interchange(a[, newrow:m], newrow, piv, rowexchange);
# pick a column pivot #
col[newrow] := piv :=
maxind(a[newrow, newrow:m AT newrow]);
interchange(a, newrow, piv, colexchange);
temp := a[newrow, newrow];
IF ABS temp<delta
THEN
sing := TRUE;
rank := newrow-1;
CLEAR b[rank+1:m];
GOTO backsub
FI;
FOR i FROM newrow+1 TO m
DO
mult := a[i, newrow]/temp;
a[i, newrow+1:m] := mult*a[newrow, newrow+1:m];
b[i] := mult*b[newrow]
OD # i #
OD # newrow #;
# now back substitute #
b[rank] := a[rank, rank];
FOR i FROM rank-1 BY -1 TO 1
DO (b[i] := a[i, i+1:rank]*b[i+1:rank])/:=a[i, i]
OD;
# now resort #
FOR i FROM n-1 BY -1 TO 1
DO interchange(b, i, col[i], colexchange)
OD;
mprev := m;
sing
END # leqdirect #;
PROC setm = ( INT mold) INT :
# computes a suitable value for the size of the first block #
BEGIN
REAL temp, sum;
INT m := mold;
IF m=0
THEN
# check the bottom rows #
m := n;
FOR i FROM n BY -1 TO 2
WHILE
((temp := ABS (1.0+a[i, i]))=0.0) AND
((sum := NORM1 a[i, ]) < delta*temp)
DO m--:=1
OD
FI;
# now check the sides #
IF m NE n
THEN
REAL anorm := m+1;
FOR i TO n DO anorm+:= NORM1 a[i, ] OD;
anorm:=cutoff;
FOR i
WHILE (i<m AND m<n)
DO
sum := 0.0;
FOR j FROM n BY -1 TO m+1
WHILE
IF sum>anorm THEN m := j FI;
sum<=anorm
DO sum+:= ABS a[i, j]
OD
OD;
SKIP
FI;
# if we are close to n, the hell with iterating #
IF (m/n)>0.8 THEN m := n FI;
# force m>mold by a reasonable margin #
m := (ROUND (1.2*mold)) MAX m;
# check that this is not too much #
m := m MIN n
END # setm #;
PROC leqiter =
( REF [, ] REAL adold, REF [] INT rowold, colold)
# a modified version of proc leqiter, ref(2) #
BEGIN
INT mnew;
REAL eps := acc+1, epsprev := acc+2,
convergencefactor := 1, epp, temp;
BOOL singular, oscillating := FALSE;
# first update the value of m and get appropriate
workspace #
mnew := setm(m);
[1:mnew, 1:mnew] REAL ad;
[1:mnew] REAL delt;
[1:mnew] INT row, col;
# form appropriate part of the matrix ip+k*c and place
in ad #
IF adold ISNT null
THEN
ad[1:m, 1:m] := adold;
row[1:m] := rowold;
col[1:m] := colold;
FOR i TO m
DO postconvert(a[i, ], ad[i, m+1:mnew AT m+1])
OD
ELSE m := 0
FI;
FOR i FROM m+1 TO mnew
DO
postconvert(a[i, ], ad[i, ]);
ad[i, i] += IF i=1 THEN 2.0 ELSE 1.0 FI
OD;
REF [] REAL x0 = x[1:mnew], b0 = b[1:mnew];
notconverged := converging := TRUE;
FOR iter
WHILE notconverged AND converging
DO
# form y=c*x #
preconvert(x, y);
# compute change in first m components of x #
(delt := b0)-:=x0;
delt[1]-:=x[1];
delt := a[1:mnew, ]*y;
singular := leqdirect(ad, delt, row, col, m);
# note that leqdirect sets m:=mnew #

```



```

d[m + i] := d[m + i] - d[m + i + 1]/u[i + 1]
end;
alpha := -1./(u[1] + s[1]); temp := (u[1]**2 - s[1]**2);
d[m] := (d[m] + alpha*(d[m - 1] + d[m + 1]))/a;
t := (d[m - 1]*u[1] - s[1]*d[m + 1])/temp;
d[m + 1] := (u[1]*d[m + 1] - s[1]*d[m - 1])/temp;
d[m - 1] := t; temp := d[m + 1];
for i := 2 step 1 until c do
begin
d[m - i] := (d[m - i] - s[i]*temp)/u[i];
d[m + i] := (d[m + i] - s[i]*t)/u[i]
end
end madison;

```

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Algorithm 99

ON THE CONSTRUCTION OF BALANCED BINARY TREES FOR PARALLEL PROCESSING

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Authors' note

Over the past few years new computer architectures have emerged which possess a number of arithmetic units or processors. To utilise these machines efficiently statements should be compiled so as to indicate where several parts of an arithmetic expression (or indeed several sequential expressions) can be computed in parallel.

If an arithmetic expression is represented by a binary tree any operations that appear at the same level within the tree can be assigned to separate arithmetic units or processors and computed in parallel.

In this paper we present a method which produces a binary tree representation of an arithmetic expression which is of minimum height wherever possible. Throughout, emphasis will be directed to an algorithmic process to be used for creating such trees, which will be incorporated within the compiling process.

1. Formation of a balanced tree

Methods of forming tree representations of arithmetic expressions are well known and given in Knuth (1968). We consider the formation of a binary tree of minimum height for its composite elements and subtrees. Such a tree will be called a 'balanced binary tree' or a 'balanced tree'. The remaining terminology will be taken as that given by Knuth (1968; 1973).

We now consider the specific case where a balanced binary tree is systematically constructed from single element components (see Fig. 1). Assume that the first element is attached to the null node, then a second element can be added by forming a new node whose left hand son is the original element and whose right hand son is the new element (this is called 'inserting one place above'). Further elements can then be added, the third by inserting a new node two places above the previous element whilst a fourth can be added by inserting a new node one place above the third element. Finally, the

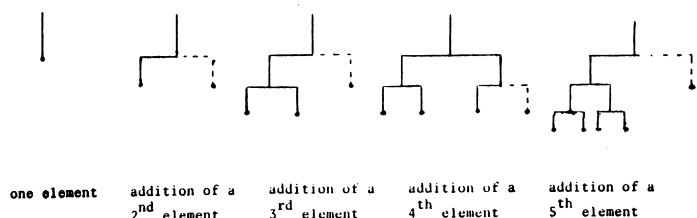


Fig. 1

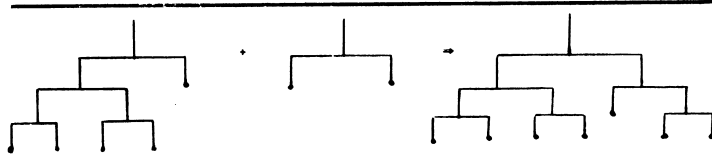


Fig. 2(a)

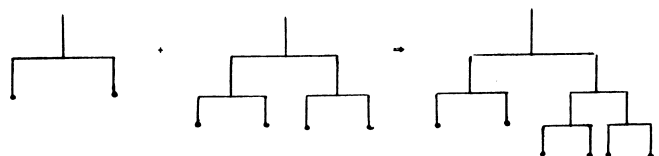


Fig. 2(b)

fifth element can be added by inserting a new node three places above the fourth element, etc. This tree construction process can be enumerated by using a numeric code which is generated in the following manner. At any point on the tree the number 1 is used to represent the placing of an element one place above the previous entry in the tree and the number 2 to represent its placing two positions above. So the four insertions shown in Fig. 1 can be represented by a code given by the series of numbers 1, 2, 1, 2.

To extend this process the requirements of balancing dictates that the following three insertions will be in the same manner as the first 3 (i.e., 1, 2, 1). The eighth, that is the 2^3 , insertion will be situated at the fourth ($3 + 1$) level above all the other nodes. In general then the next $2^i - 1$ insertions will be in the same manner as the first $(2^i - 1)$ insertions and the $2^{(i+1)}$ th insertion will be at the $(i + 2)$ th level above all other nodes.

2. Addition of subtrees to an existing tree

The process outlined in the previous section will allow single elements to be inserted into a tree but it is also useful to be able to add subtrees to an existing tree where the subtrees will retain their structure within the overall tree structure. To do this the following criteria are defined:

1. Any increase in the overall height of the tree caused by the insertion process should be kept to an absolute minimum. This is so that the number of levels in the tree will continue to be minimised.
2. An insertion at the top of the tree is preferable to extending the tree below the lowest existing level. This provides for possible, future extensions to the tree. If we extend the tree below the lowest existing level then the next insertion *must* also extend the height of the tree. If the tree is extended above all existing levels the next insertion *may not* extend the overall height of the tree.
3. The subtrees should be placed in the first available position in the tree, providing the previous conditions are met. This again is done to provide for future extensions to the tree, so that the maximum number of vacant nodes are available for successive insertions.

Previously the position for insertion of a new node has been defined in terms of the previous element inserted. For the insertion of a subtree a dummy pointer will be required so that the next insertion can be implemented at the correct position in the tree. The value of this dummy pointer will depend on the relative heights of the subtree and the tree into which it is to be inserted. If the subtree is shorter than the tree into which it is being inserted then it is assumed that the maximum number of elements that could be held by a subtree of that number of levels has been added, and the dummy pointer is theoretically obtained from the last element added. If the subtree

height is greater than or equal to that of the tree into which it is being inserted then a different approach is necessary. Since the next insertion will be required to be above the join of the tree and the subtree (the reasoning being the same as that for criterion 2), then the dummy pointer will need to be theoretically taken from the last element inserted in a tree (containing the maximum number of elements) of one level greater than the subtree actually inserted. Details of this procedure for the additions of subtrees can be seen in Fig. 2(a) and (b).

3. Conclusion

A great deal of research has been carried out into the handling of binary trees containing data, see for instance Day (1976). Some work has also been done in producing syntactic trees with a minimum number of levels, see for instance Baer and Bovet (1968). In comparison the algorithm described here will produce a binary tree representation of the elements and subtrees as given, which will have minimum height possible for such a tree without having to reorder the expression. Any operations that appear at the same level within the binary tree can be assigned to separate arithmetic units or processors and computed in parallel.

4. ALGOL 68 procedure

A procedure that balances trees in the manner described hitherto has been written and tested in ALGOL 68.

Throughout the algorithm the existence of a recursive ALGOL 68 MODE TREE is assumed with at least the following five fields:

- LEFT this is a reference to the tree that is the left hand son of the present tree. This can be null if there is no left hand son.
- OPERATOR this is the operator (e.g. +) that joins the left and right hand son, or if a leaf node, the variable name.
- RIGHT this is a reference to the tree that is the right hand son of the present tree. This tree can be null if there is no right hand son.
- LEVEL this is the level of the operator in the overall tree, usually one for a variable.
- FATHER this is a reference to the tree that is the father of the present tree. This tree can be null if this tree has no father.

Other fields may be added to meet the needs of a given situation. The following ALGOL 68 declaration will define the structure explained.

```
MODE TREE = STRUCT(REF TREE left, STRING operator,
REF TREE right, INT level, REF TREE father)
```

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```
C*****
<make balanced tree> adds an item or a sub-tree to an existing tree,
at the most suitable point for an entry of its size
*****C
PROC make balanced tree=(REF INT next,randtop,optop,
INT last REF [] TREE this,
REF REF TREE orig.[] REF TREE randstack,
[] CHAR operators)
VOID:
C-----
next indicates the next free position in the array of trees<this>,
originally 0
randtop indicates the top item of<randstack>
optop indicates the number of entries in<operators>
last indicates where in<this>references to the current set of sub-trees
begins, initially 1
this a stack of trees used to hold all subtrees formed
orig contains the current sub-tree
randstack a stack containing sub-trees and operands
operators a stack of operators, which correspond to the operands
this procedure will form a balanced tree of operands and operators,
as long as the operator remains the same
-----C
```

```
(INT temp;
INT count,prev,pcount;
CHAR oper<operators[optop];
pcount<0;
INT nooflevels<12;
[1:2*nooflevels-1] INT predefined;
INT value<1;
predefined[1]<1;
FOR i FROM 2 TO nooflevels DO
(value TIMES 2;predefined[value]<i;
predefined[value+1:2*value-1]<predefined[1:value-1]);
OP '>=(TREE expra,exprb) INT:
(INT lev<(level OF expra>level OF exprb!level OF expra!
level OF exprb)+1;lev);
C*****
<pa>adjusts<point>so that instead of pointing to a node it points to
to its father
*****C
PROC pa=(REF INT point) VOID:
(INT temp<point;
FOR il FROM last TO next WHILE temp=point DO
WHILE this[il] IS father OF this[point] DO point<il);
-----C
attach first element or sub-tree to null node
-----C
next PLUS 1;
level OF this[next]<level OF randstack[randtop];
left OF this[next]<randstack[randtop];
operator OF this[next]<oper;
orig<left OF this[next];
randtop MINUS 1;
prev<next;
count<2+(level OF this[next]-1);
C-----
the loop that builds up the tree
-----C
WHILE (optop>= LWB operators AND randtop>=LWB randstack
oper=operators[optop]! FALSE) DO
(optop MINUS 1;
next PLUS 1;
temp<0;
IF level OF randstack[randtop]>=level OF orig THEN
count<2+(level OF orig-1)
ELSE WHILE level OF randstack[randtop]>predefined[count] DO
count PLUS 1
FI;
left OF this[next]<randstack[randtop];
operator OF this[next]<oper;
IF predefined[count]=1
OR pcount=0
THEN
place one place above the previous entry
-----C
father OF this[next]<this[prev];
right OF this[next]<left OF this[prev];
left OF this[prev]<this[next]
ELSE
place <temp> 1 places above the previous entry
-----C
temp<predefined[count]-level OF this[prev];
FOR i TO temp WHILE operator OF (father OF this[prev])#<oper
DO pa(prev);
father OF this[next]<father OF this[prev];
IF operator OF (father OF this [prev])=oper THEN
operator OF (father OF this [next])<oper
ELSE IF this [prev] IS right OF (father OF this [prev]) THEN
right OF (father OF this [prev])<this[next]
ELSE left OF (father OF this [prev])<this[next]
FI;
father OF this [prev]<this[next];
right OF this[next]<this[prev]
FI;
C-----
if a sub-tree of level greater than one has been added update count
to allow for this
-----C
IF level OF randstack[randtop]=1 THEN prev<next
ELSE level OF randstack[randtop]>=level OF orig THEN
prev<next;
count<2+(level OF randstack[randtop])-1
ELSE count PLUS 2+(level OF randstack[randtop]-1)-1;
FOR il FROM last TO next-1 DO
IF this[il] IS left OF this[next] THEN
prev<il;
father OF this[prev]<this[next];
GOTO 1;
FI;
1: SKIP
FI;
IF operator OF (father OF this[next])=oper OR pcount=0 THEN
orig<this[next]; pcount<1
FI;
count PLUS 1;
randtop MINUS 1;
temp<next;
C-----
update levels of all trees affected by this insertion
-----C
IF operator OF this[temp]= oper THEN
level OF this[temp]<left OF this[temp]>right OF this[temp]
ELSE
WHILE operator OF this[temp]#<oper DO
(level OF this [temp]<left OF this[temp])'>
right OF this[temp]:pa(temp)
FI);
```

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