

Factorizations for some classes of matrices related to positivity

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Abstract—We describe factorizations for some classes of matrices related to positivity and important in applications. The classes of matrices considered include nonsingular M -matrices (matrices with nonpositive off-diagonal entries with positive inverse) and totally nonnegative matrices (matrices with all minors nonnegative). The considered factorizations include rank revealing factorizations, LDU-factorization, QR-factorization and symmetric-triangular factorization. Applications of these factorizations are presented.

I. INTRODUCTION

We present some recent factorizations for some classes of matrices related to positivity and important in applications. The considered factorizations include rank revealing factorizations, LDU-factorization, QR-factorization and symmetric-triangular factorization. An important advance performed during the last years consists of finding some classes of matrices for which relevant computations (such as computing singular values or solving linear systems) can be carried out with high relative accuracy. These classes of matrices are formed either by sign-regular matrices or by M -matrices diagonally dominant. Section 2 is devoted to factorizations of sign-regular matrices and its important subclasses and Section 3 are devoted to factorizations of M -matrices diagonally dominant.

Let us recall the definitions of the classes of matrices considered in this paper. An $n \times n$ matrix A is *strictly sign regular* (SSR) if, for each k ($1 \leq k \leq n$), all $k \times k$ submatrices of A have determinant with the same strict sign. These matrices are characterized as variation-diminishing linear maps: the maximum number of sign changes in the consecutive components of the image of a nonzero vector is bounded above by the minimum number of sign changes in the consecutive components of the vector (see Theorem 5.3 of [1]). These matrices appear in many fields: see, for instance, [1], and the books [26], [20] and [38] (for applications to computer aided geometric design). A very important subclass of the strictly sign regular matrices is formed by the totally positive matrices. A matrix is *totally positive* (TP) if all its minors are positive. If all its minors are nonnegative, then we say that the matrix is *totally nonnegative*. This terminology is more frequent nowadays in the context of Linear Algebra, although TP matrices and totally nonnegative matrices also have been called strictly totally positive matrices and totally positive matrices, respectively. Finally, a matrix is totally negative (TN) if all its minors

are negative. Totally negative matrices belong to the class of N -matrices (matrices with all principal minors negative), which play an important role in Economy (see [3], [35] and [43]). Other aspects of totally negative matrices have been considered in [2], [13], [5] and [18].

Section 3 includes some factorizations and applications of M -matrices. Let us recall that if a matrix whose off-diagonal entries are nonpositive can be expressed as

$$A = sI - B, \quad B \geq 0, \quad s \geq \rho(B)$$

(where $\rho(B)$ is the spectral radius of B), then it is called an M -matrix. M -matrices have important applications, for instance, in iterative methods in numerical analysis, in the analysis of dynamical systems, in economics and in mathematical programming.

II. FACTORIZATIONS OF TOTALLY POSITIVE MATRICES AND RELATED CLASSES OF MATRICES

A. Basic notations

Let us start with some basic notations. Following [1], for $k, n \in \mathbb{N}$, $1 \leq k \leq n$, $Q_{k,n}$ will denote the set of all increasing sequences of k natural numbers not greater than n . For each $\alpha \in Q_{k,n}$, its dispersion number $d(\alpha)$ is defined by $d(\alpha) := \sum_{i=1}^{k-1} (\alpha_{i+1} - \alpha_i - 1) = \alpha_k - \alpha_1 - (k-1)$, with the convention $d(\alpha) = 0$ for $\alpha \in Q_{1,n}$. Let us observe that $d(\alpha) = 0$ means that α consists of k consecutive integers.

For $\alpha = (\alpha_1, \alpha_2, \dots, \alpha_k)$, $\beta = (\beta_1, \beta_2, \dots, \beta_k) \in Q_{k,n}$ and A an $n \times n$ matrix, we denote by $A[\alpha|\beta]$ the $k \times k$ submatrix of A containing rows $\alpha_1, \alpha_2, \dots, \alpha_k$ and columns $\beta_1, \beta_2, \dots, \beta_k$ of A . If $\alpha = \beta$, we denote by $A[\alpha] := A[\alpha|\alpha]$ the corresponding principal minor. Let A be an $n \times n$ lower (resp., upper) triangular matrix. Following [9], the minors $\det A[\alpha|\beta]$ with $\alpha_k \geq \beta_k$ (resp., $\alpha_k \leq \beta_k \forall k$) are called nontrivial minors of A because all the remaining minors are obviously equal to zero. A triangular matrix A is called Δ TP if its nontrivial minors are all positive. We remark that these matrices are also called Δ STP in other papers (see [19]).

By a *signature sequence* we mean an (infinite) real sequence $\varepsilon = (\varepsilon_i)$ with $|\varepsilon_i| = 1$, $i = 1, 2, \dots$. An $n \times n$ matrix A verifying $\varepsilon_k \det A[\alpha|\beta] > 0$ for all $\alpha, \beta \in Q_{k,n}$ and $k = 1, \dots, n$ is called *strictly sign regular* with signature $\varepsilon_1, \dots, \varepsilon_n$, and will be denoted by SSR.

B. LDU-factorizations

An LDU-factorization of a matrix A is the decomposition $A = LDU$ where L (resp., U) is a lower (resp., upper) triangular, unit diagonal matrix (i.e., with all diagonal entries

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obtain $A^{(t+1)}$ from $\tilde{A}^{(t)}$ we produce zeros in column t below the *pivot element* $\tilde{a}_{tt}^{(t)}$ by subtracting multiples of row t from the rows beneath it. We say that we carry out a *symmetric pivoting strategy* when we perform the same row and column exchanges, that is, $PAP^T = LDU$, where P is the associated permutation matrix. A real matrix with nonpositive off-diagonal elements is called a Z -matrix. Let us recall that if a Z -matrix can be expressed as

$$A = sI - B, \quad B \geq 0, \quad s \geq \rho(B)$$

(where $\rho(B)$ is the spectral radius of B), then it is called an M -matrix. Nonsingular M -matrices form a subclass of Z -matrices and have important applications, for instance, in iterative methods in numerical analysis, in the analysis of dynamical systems, in economics and in mathematical programming. Nonsingular M -matrices have many equivalent definitions. In fact, in Theorem 2.3 in Chapter 6 of [4] appear fifty equivalent definitions.

A *rank revealing decomposition* of a matrix A is defined in [10] as a decomposition $A = XDY^T$, where X, Y are well conditioned and D is a diagonal matrix. In that paper it is shown that if we can compute an accurate rank revealing decomposition then we also can compute (with an algorithm presented there) an accurate singular value decomposition.

We say that we compute an accurate LDU -decomposition if we compute with small relative error each entry of L, D and U , that is, the relative error of each mentioned entry is bounded by $\mathcal{O}(\varepsilon)$, where ε is the machine precision. Given an algebraic expression defined by additions, subtractions, multiplications and divisions and assuming that each initial real datum is known to high relative accuracy, then it is well known that the algebraic expression can be computed accurately if it is defined by sums of numbers of the same sign, products and quotients. In other words, the only forbidden operation is true subtraction, due to possible cancellation in leading digits.

Given an M -matrix A diagonally dominant by rows (resp., columns), the off-diagonal elements and the row sums (resp., column sums) are natural parameters in many applications and that small relative changes in those quantities produce small relative changes in the entries of A (and of A^{-1} if A is nonsingular). In conclusion, we assume that, if A is diagonally dominant by columns, we know the off-diagonal entries and the column sums. From now on, let us assume that these natural parameters are given. In [11], Demmel and Koev used complete pivoting to obtain an accurate LDU -decomposition of an M -matrix diagonally dominant by columns that is a rank revealing decomposition because L is diagonally dominant by columns (and so it is very well conditioned) and U has rows whose entry of maximal absolute value belongs to the main diagonal (and so it is well conditioned).

In [40] we provided, given an M -matrix diagonally dominant by columns and knowing the off-diagonal entries and the column sums, an accurate LDU -decomposition of an M -matrix diagonally dominant by columns that is a rank revealing decomposition because L is diagonally dominant

by columns (and so it is very well conditioned) and U diagonally dominant by rows (and so it is also very well conditioned). For this purpose we used the pivoting strategy that we now present.

In [37] we defined a symmetric *maximal absolute diagonal dominance* (m.a.d.d.) pivoting as a symmetric pivoting which chooses as pivot at the t th step ($1 \leq t \leq n-1$) a row $i_t (\geq t)$ satisfying

$$|a_{i_t i_t}^{(t)}| - \sum_{j \geq t, j \neq i_t} |a_{i_t j}^{(t)}| = \max_{t \leq i \leq n} \{ |a_{ii}^{(t)}| - \sum_{j \geq t, j \neq i} |a_{ij}^{(t)}| \}.$$

In order to determine uniquely the strategy, we suppose that we choose the first index $i_t (\geq t)$ satisfying the previous property and such that $a_{i_t i_t}^{(t)} \neq 0$, and then we interchange the row and column t by the row and column i_t .

If we have an M -matrix A diagonally dominant by rows or columns, the symmetric m.a.d.d. pivoting also provides an LDU -decomposition with L and U very well conditioned as the following result (corresponding to Proposition 3.5 of [40]) shows.

Theorem 3.1. If A is an M -matrix diagonally dominant by rows or columns and P is the permutation matrix associated to the symmetric m.a.d.d. pivoting strategy of A or A^T , respectively, then $PAP^T = LDU$, where L is a lower triangular matrix diagonally dominant by columns and U is an upper triangular matrix diagonally dominant by rows.

The corresponding efficient and with high relative accuracy algorithm for the LDU -decomposition of diagonally dominant M -matrices of Theorem 3.1 was developed in Section 4 of [40].

Recently, Ye has obtained in [45] the extension to all diagonally dominant matrices the accurate algorithms for their LDU -decomposition, so that this factorization provides a rank revealing decomposition. For this purpose he proposes the use of complete pivoting (as in [11]) as well as the symmetric m.a.d.d. pivoting of [40], called in [45] column diagonally dominant pivoting strategy.

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