

NOTES ON THE BIRKHOFF ALGORITHM FOR DOUBLY STOCHASTIC MATRICES

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ABSTRACT. The purpose of this note is to tie together some results concerning doubly stochastic matrices and their representations as convex combinations of permutation matrices.

Let Ω_n denote the set of $n \times n$ doubly stochastic matrices. Thus an $n \times n$ matrix $S = [s_{ij}]$ belongs to Ω_n provided $s_{ij} \geq 0$ ($i, j = 1, \dots, n$), and the sum of the entries in each row and in each column of S equals one. It is readily verified that Ω_n is a convex polytope in Euclidean n^2 -space, and it was shown in [8] that Ω_n has dimension $n^2 - 2n + 1$. Birkhoff [1; 10, p. 58] proved that the extreme points of Ω_n are the $n \times n$ permutation matrices, and in doing so gave an algorithm for writing a doubly stochastic matrix as a convex combination of permutation matrices.

Let $A = [a_{ij}]$ be an $n \times n$ matrix of 0's and 1's such that for each (e, f) with $a_{ef} = 1$, there is a permutation matrix $P = [p_{ij}]$ where $p_{ef} = 1$ and $P \leq A$ (the order relation is entrywise). Then A is said to have *total support*. It was proved in [3] that the faces of Ω_n are in one-to-one correspondence with the $n \times n$ matrices A of 0's and 1's with total support; the face of Ω_n associated with A is

$$\mathcal{F}(A) = \{S \in \Omega_n : S \leq A\}.$$

If A has total support, then there is a largest integer $k \geq 1$ such that after reordering rows and columns, A is a direct sum $A_1 \oplus \dots \oplus A_k$ where A_1, \dots, A_k have total support. Since k is maximum A_1, \dots, A_k cannot be decomposed further into direct sums and are called the *fully indecomposable components* of A . It was proved in [3] by an elementary combinatorial argument that

$$\dim \mathcal{F}(A) = \sigma(A) - 2n + k$$

where $\sigma(A)$ is the number of positive entries of A . It now follows from the

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classical theorem of Caratheodory [5] that every matrix in $\mathcal{F}(A)$ can be written as a convex combination of no more than $\sigma(A) - 2n + k + 1$ permutation matrices.

Let $S = [s_{ij}] \in \Omega_n$ and let $S_{(0,1)}$ be the matrix obtained from S by replacing each positive entry with a one. Thus $\mathcal{F}(S_{(0,1)})$ is the smallest face of Ω_n containing S . The *Birkhoff algorithm* for expressing S as a convex combination of permutation matrices proceeds as follows. Choose a smallest positive entry $c_1 = s_{kl}$ of S . Then there exists a permutation matrix $P_1 = [p_{ij}]$ such that $p_{kl} = 1$ and $P_1 \leq S_{(0,1)}$. The matrix $S_1 = S - c_1 P_1$ is a nonnegative matrix having at least one more zero entry than S . We repeat with S_1 replacing S (the matrix S_1 , if not the zero matrix, can be normalized to a doubly stochastic matrix if desired by multiplying by $1/(1 - c_1)$), and continue until the zero matrix is obtained. We shall relax this algorithm somewhat by reversing the order of its two major components. Namely, we first choose a permutation matrix $P_1 \leq S_{(0,1)}$ and then choose the smallest (positive) entry in those positions of S corresponding to the 1's of P . The matrix $S_1 = S - c_1 P_1$ still has at least one more zero entry than S . We call any representation of S as a convex combination $c_1 P_1 + \cdots + c_t P_t$ of permutation matrices which is obtained in this way a *Birkhoff representation* of S .

How good is the Birkhoff algorithm? Good enough so that it expresses S as a convex combination of permutation matrices whose number does not exceed that which is guaranteed by Caratheodory's theorem:

- (1) Birkhoff's algorithm expresses the doubly stochastic matrix S as a convex combination of no more than $\sigma(S_{(0,1)}) - 2n + k + 1$ permutation matrices (where k is the number of fully indecomposable components of $S_{(0,1)}$).

The property (1) above was first established by Johnson, Dulmage, and Mendelsohn [7]. Another proof has been given by Nishi [9]. An alternative, and perhaps more revealing, proof can be given using the property:

- (2) Each step of Birkhoff's algorithm lowers by at least one the dimension of the smallest face of Ω_n containing the doubly stochastic matrix.

To verify (2), let S be an $n \times n$ doubly stochastic matrix. It suffices to assume that $S_{(0,1)}$ is fully indecomposable. Let $T = (1 - c)^{-1} (S - cP)$ where $P \leq S_{(0,1)}$ is a permutation matrix and c is the smallest positive entry of S at positions corresponding to the 1's of P . Then T is doubly stochastic and has at least one more zero entry than S . The matrix $T_{(0,1)}$ then has total support and at least one more zero entry than $S_{(0,1)}$. Suppose that $T_{(0,1)}$ has $p \geq 1$ fully indecomposable components. Then after reordering of rows and columns, $T_{(0,1)} = B_1 \oplus \cdots \oplus B_p$ where B_1, \dots, B_p are fully indecomposable. Since $T_{(0,1)} \leq S_{(0,1)}$

and $S_{(0,1)}$ is fully indecomposable, it follows that $\sigma(S_{(0,1)}) \geq \sigma(T_{(0,1)}) + p$. Hence

$$\begin{aligned} \dim \mathcal{F}(T_{(0,1)}) &= \sigma(T_{(0,1)}) - 2n + p \\ &\leq \sigma(S_{(0,1)}) - p - 2n + p \\ &\leq \dim \mathcal{F}(S_{(0,1)}) - 1. \end{aligned}$$

Property (1) is now a consequence of (2). For, if $S \in \Omega_n$ and $S_{(0,1)}$ has k fully indecomposable components, then $\dim \mathcal{F}(S_{(0,1)}) = \sigma(S_{(0,1)}) - 2n + k$. Hence after at most $\sigma(S_{(0,1)}) - 2n + k$ steps of the Birkhoff algorithm, the resulting doubly stochastic matrix lies in a face of Ω_n of dimension 0, that is, is a permutation matrix. It follows that S is then expressed as a convex combination of at most $\sigma(S_{(0,1)}) - 2n + k + 1$ permutation matrices.

A lower bound for the minimum number of permutation matrices in a representation of a doubly stochastic matrix as a convex combination of permutation matrices can be obtained as follows. Let $A = [a_{ij}]$ be an $n \times n$ matrix of 0's and 1's with total support. Let U be a set of positions of A such that $(k, l) \in U$ implies $a_{kl} = 1$. Then U is said to be *strongly stable* [2] provided each permutation matrix $P = [p_{ij}]$ with $P \leq A$ satisfies $p_{kl} = 1$ for at most one $(k, l) \in U$. Denote by $\alpha(A)$ the maximum cardinality of a strongly stable set of positions of A . In [2] it is shown that $\alpha(A) = \max \sigma(X)$ where the maximum is taken over all submatrices X of A such that the submatrix of A complementary to X (the one formed by the rows complementary to the rows in which X lies and the columns complementary to the columns in which X lies) is a $p \times (n - 1 - p)$ zero submatrix for some $p = 0, 1, \dots, n - 1$. In particular, $\alpha(A)$ is at least equal to the maximum number of 1's in a row (take $p = n - 1$) and in a column (take $p = 0$) of A . The following property is immediate.

- (3) The $n \times n$ doubly stochastic matrix S cannot be expressed as a convex combination of fewer than $\alpha(S_{(0,1)})$ permutation matrices. In particular, Birkhoff's algorithm expresses S as a convex combination of at least $\alpha(S_{(0,1)})$ permutation matrices.

In (1) and (3) are given upper and lower bounds for the number of steps required in any application of Birkhoff's algorithm to a doubly stochastic matrix. We shall show that in each case equality can always be obtained and in the following strong sense: no matter how Birkhoff's algorithm is carried out the number of permutation matrices achieves equality. Before doing so, we first illustrate the following property:

- (4) The number of permutation matrices in a Birkhoff representation of a doubly stochastic matrix S need not be unique.

Let S be the doubly stochastic matrix

$$\frac{1}{6} \begin{bmatrix} 1 & 4 & 0 & 1 \\ 2 & 1 & 3 & 0 \\ 2 & 1 & 1 & 2 \\ 1 & 0 & 2 & 3 \end{bmatrix}.$$

Then $S = \frac{1}{6}P_1 + \frac{1}{6}P_2 + \frac{1}{3}P_3 + \frac{1}{3}P_4$ is a Birkhoff representation of S , where

$$P_1 = \begin{bmatrix} 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 0 \\ 0 & 1 & 0 & 0 \\ 1 & 0 & 0 & 0 \end{bmatrix}, \quad P_2 = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix},$$

$$P_3 = \begin{bmatrix} 0 & 1 & 0 & 0 \\ 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 0 \end{bmatrix}, \quad P_4 = \begin{bmatrix} 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}.$$

Also $S = \frac{1}{6}Q_1 + \frac{1}{6}Q_2 + \frac{1}{6}Q_3 + \frac{1}{6}Q_4 + \frac{1}{3}Q_5$ is a Birkhoff representation of S where

$$Q_1 = \begin{bmatrix} 0 & 0 & 0 & 1 \\ 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \end{bmatrix}, \quad Q_2 = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 0 \end{bmatrix}, \quad Q_3 = \begin{bmatrix} 0 & 1 & 0 & 0 \\ 1 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix},$$

$$Q_4 = \begin{bmatrix} 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \\ 1 & 0 & 0 & 0 \end{bmatrix}, \quad Q_5 = \begin{bmatrix} 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}.$$

Let A be an $n \times n$ matrix of 0's and 1's with total support. Then from the formula for $\alpha(A)$ it follows that the strong stability number $\alpha(A)$ of A satisfies $1 \leq \alpha(A) \leq \lceil n/2 \rceil \lfloor (n+1)/2 \rfloor$. If $n \geq 2$ and A is fully indecomposable, then each row and column of A contains at least two 1's, so that $2 \leq \alpha(A)$.

- (5) Let t be an integer with $1 \leq t \leq \lceil n/2 \rceil \lfloor (n+1)/2 \rfloor$. Then there exists an $n \times n$ doubly stochastic matrix S such that $\alpha(S_{(0,1)}) = t$ and each Birkhoff representation of S uses exactly t distinct permutation matrices.

If $t = 1$, then in (5) we may take S to be an $n \times n$ permutation matrix. To complete the verification we let $t \geq 2$ and construct an $n \times n$ fully indecomposable matrix A of 0's and 1's with $\alpha(A) = t$ such that $\mathcal{F}(A)$ is a simplex of dimension $t - 1$. It then follows that a doubly stochastic matrix S in the interior of $\mathcal{F}(A)$ (that is, $S_{(0,1)} = A$) requires exactly t distinct permutation matrices in each of its representations as a convex combination of permutation matrices.

For $1 \leq p, q \leq n$, the $n \times n$ matrix $E = [e_{ij}]$ where $e_{pq} = 1$ and $e_{ij} = 0$ otherwise is denoted by E_{ij}^n .

- (7) Let A be an $n \times n$ fully indecomposable matrix of 0's and 1's. Then there is a tree matrix T with $I_n \leq T \leq A$ such that the $p = \sigma(A) - 2n + 1$ positions of $A - T$ whose entries equal one can be ordered as $(i_1, j_1), \dots, (i_p, j_p)$ where for $l = 1, \dots, p$ there is a permutation matrix P_l whose (i_l, j_l) entry equals one and

$$P_l \leq T + E_{i_1 j_1}^n + \dots + E_{i_l j_l}^n.$$

We first verify (7) for nearly decomposable matrices by induction on n . The case $n = 1$ being trivial, we let $n \geq 2$. We may assume A has the form (6) where A_1 is an $n_1 \times n_1$ nearly decomposable matrix and $1 \leq n_1 \leq n - 1$. By induction there is a tree matrix T_1 with $I_{n_1} \leq T_1 \leq A_1$ such that the s positions of $A_1 - T_1$ with a nonzero entry can be ordered as $(i_1, j_1), \dots, (i_s, j_s)$ where for $l = 1, \dots, s$ there is a permutation matrix Q_l whose (i_l, j_l) entry is one and

$$Q_l \leq T_1 + E_{i_1 j_1} + \dots + E_{i_l j_l}.$$

Let

$$T = \left[\begin{array}{c|cccccc} T_1 & & & & & 0 \\ \hline & 1 & 0 & \cdots & 0 & 0 \\ & 1 & 1 & \cdots & 0 & 0 \\ & F & \vdots & \vdots & \vdots & \vdots \\ & & 0 & 0 & \cdots & 1 & 0 \\ & & 0 & 0 & \cdots & 1 & 1 \end{array} \right]$$

Then $I_n \leq T \leq A$ and T is a tree matrix. Since A is nearly decomposable (and hence fully indecomposable) there is a permutation matrix $P \leq A$ whose $(1, n)$ -entry equals one. It now follows easily that the ordering $(i_1, j_1), \dots, (i_s, j_s), (1, n)$ of the positions of $A - T$ with a nonzero entry has the required properties; the required permutation matrices are $P_1 = Q_1 \oplus I_{n-n_1}, \dots, P_s = Q_s \oplus I_{n-n_1}, P_{s+1} = P$. Thus (7) holds for nearly decomposable matrices. Now let B be an $n \times n$ fully indecomposable matrix which is not nearly decomposable. Then by replacing certain 1's with 0's, we arrive at a nearly decomposable matrix A with $A \leq B$. Let T be a tree matrix with $I_n \leq T \leq A$ satisfying (7). Ordering the positions of $B - T$ with nonzero entries as $(i_1, j_1), \dots, (i_p, j_p), (i_{p+1}, j_{p+1}), \dots, (i_q, j_q)$ where $(i_{p+1}, j_{p+1}), \dots, (i_q, j_q)$ are the positions of $B - A$ with a nonzero entry in any order, we complete the verification.

We now construct doubly stochastic matrices for which equality holds in (1).

(8) Let A be an $n \times n$ fully indecomposable matrix of 0's and 1's. Then in the notation of (7) the matrix

$$S = \frac{1}{2^{p+1}-1} (2^p I_n + 2^{p-1} P_1 + \dots + 2 P_{p-1} + P_p)$$

is in the face $\mathcal{F}(A)$ of dimension $p = \sigma(A) - 2n + 1$. Every representation of S as a convex combination of permutation matrices requires at least $p + 1$ distinct permutation matrices. Every Birkhoff representation of S requires exactly $p + 1$ permutation matrices.

To verify (8) we argue with $S' = (2^{p+1} - 1)S$ instead of S . Suppose S' is written as a nonnegative linear combination of t permutation matrices Q_1, \dots, Q_t . At least one of the matrices Q_1, \dots, Q_t has a one in the (i_p, j_p) -position, and the sum of the coefficients of all such matrices is $b_p = 1$. Hence at least one of the permutation matrices Q_1, \dots, Q_t has a zero in the (i_p, j_p) -position and a one in the (i_{p-1}, j_{p-1}) -position; the sum of the coefficients of all such matrices is b_{p-1} where $1 \leq b_{p-1} \leq 2$. Since $b_p + b_{p-1} \leq 3$, at least one of the permutation matrices Q_1, \dots, Q_t has a zero in positions $(i_p, j_p), (i_{p-1}, j_{p-1})$, and a one in position (i_{p-2}, j_{p-2}) ; the sum of the coefficients of all such matrices is b_{p-2} where $1 \leq b_{p-2} \leq 2^2$. Continuing like this we see that $t \geq p + 1$. Since $\dim \mathcal{F}(A) = p = \sigma(A) - 2n + 1$, it follows from (1) that each Birkhoff representation of S requires at most $p + 1$ distinct permutation matrices and hence exactly $p + 1$ distinct permutation matrices.

Let A be an $n \times n$ matrix of 0's and 1's of total support with k fully indecomposable components. Using (8) one can construct doubly stochastic matrices $S \in \mathcal{F}(A)$ whose Birkhoff representations require exactly $\dim \mathcal{F}(A) + 1 = \sigma(A) - 2n + k + 1$ distinct permutation matrices.

We conclude these notes with some questions. Let $m = n!$ Since the vertices of Ω_n are the $n \times n$ permutation matrices P_1, \dots, P_m , the map

$$f : (c_1, \dots, c_m) \rightarrow c_1 P_1 + \dots + c_m P_m$$

from the $(m - 1)$ -dimensional simplex $\{(c_1, \dots, c_m) : c_i \geq 0, \sum_i c_i = 1\}$ to Ω_n is a continuous surjection, and for each $S \in \Omega_n$, $f^{-1}(S)$ is a compact convex set. Each m -tuple in $f^{-1}(S)$ furnishes a representation of the doubly stochastic matrix S as a convex combination of permutation matrices. It is a fundamental and very difficult question to ask for the m -tuple in $f^{-1}(S)$ with the fewest number of positive coordinates, that is, for a representation of S as a convex combination of the smallest possible number $c(S)$ of distinct permutation matrices. The properties (1) and (3) furnish upper and lower bounds on $c(S)$. It seems unlikely that a Birkhoff representation always exists with $c(S)$ distinct permutation matrices, although we have not constructed an example to substantiate this. It is easy to see that a Birkhoff representation corresponds to an extreme point of the polytope $f^{-1}(S)$. Are there other extreme points? The

answer most likely is in the affirmative; otherwise, there would have to be a Birkhoff representation of S with $c(S)$ permutation matrices.

Doubly stochastic matrices have been used as a basic data structure for storing and processing uncertain information in multisensor data correlation [12, 13]. In these papers, the *entropy* of an $n \times n$ doubly stochastic matrix S has been defined by

$$H(S) = \sup \{h(c_1, \dots, c_m) : (c_1, \dots, c_m) \in f^{-1}(S)\},$$

where $H(c_1, \dots, c_m) = \sum_{i=1}^m -c_i \log c_i$, the entropy of the probability distribution (c_1, \dots, c_m) . Thus the entropy of a permutation matrix is 0 and that of the $n \times n$ matrix J_n with each entry equal to $1/n$ is $\log n!$. The entropy of every other $n \times n$ doubly stochastic matrix S satisfies $0 \leq H(S) \leq \log n!$. An $n \times n$ doubly stochastic matrix S can be regarded as a probabilistic model of a bijection $h: X \rightarrow Y$ between two sets of n elements, a *fuzzy bijection*. The row sums of S being one means every element of X for sure goes someplace; the column sums of S being one means for sure every element of Y comes from someplace. Birkhoff's theorem then becomes: every fuzzy bijection is a convex combination of bijections. Since one interpretation of entropy of a probability distribution is that of a measure of uncertainty, the entropy of a fuzzy bijection (doubly stochastic matrix) can be interpreted as a measurement of the uncertainty concerning which bijection is involved. For a doubly stochastic matrix S , which representation as a convex combination of permutation matrices has entropy equal to $H(S)$? What is the largest entropy of a Birkhoff representation?

Finally we note that an extension of Birkhoff's algorithm to doubly stochastic matrices over more general number systems has been considered in [11].

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