

The Doubly Stochastic Single Eigenvalue Problem: A Computational Approach

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Abstract

The problem of determining DS_n , the complex numbers that occur as an eigenvalue of an n -by- n doubly stochastic matrix, has been a target of study for some time. The Perfect-Mirsky region, PM_n , is contained in DS_n , and is known to be exactly DS_n for $n \leq 4$, but strictly contained within DS_n for $n = 5$. Here, we present a Boundary Conjecture that asserts that the boundary of DS_n is achieved by eigenvalues of convex combinations of pairs of (or single) permutation matrices. We present a method to efficiently compute a portion of DS_n , and obtain computational results that support the Boundary Conjecture. We also give evidence that DS_n is equal to PM_n for certain $n > 5$.¹

Keywords: Doubly stochastic matrix, Eigenvalue, Group representation, Permutation matrix, Single eigenvalue problem

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1 Introduction

A matrix $A \in M_n(\mathbb{R})$ is *doubly stochastic* if $A \geq 0$ (entry-wise) and all row and column sums of A are 1. Denote the set of doubly stochastic matrices by Ω_n . The *doubly stochastic single eigenvalue problem* asks for the determination of $DS_n = \bigcup_{A \in \Omega_n} \sigma(A)$, i.e. which complex numbers occur as an eigenvalue of an n -by- n doubly stochastic matrix? This problem is unsettled for $n > 4$ and is one of the several members of the family associated with the very difficult non-negative inverse eigenvalue problem (NIEP) [Johnson et al., 2018]. Because permutation matrices are doubly stochastic, DS_n includes all roots of unity of order $k \leq n$. Denote by Π_k the convex hull of the k -th roots of unity. In [Perfect and Mirsky, 1965] it was noted that $PM_n = \bigcup_{k \leq n} \Pi_k \subseteq DS_n$, and that for $n < 4$, $PM_n = DS_n$. Recently, it was shown in [Levick et al., 2014] that $DS_4 = PM_4$. However, in [Mashreghi and Rivard, 2007], a very particular matrix in Ω_5 was exhibited with a conjugate pair of eigenvalues just outside of PM_5 . We comment on this further, later. Of course $DS_5 \subseteq DS_6$, and this conjugate pair lies in PM_6 , so that there is no implication about the relationship between PM_n and DS_n for $n > 5$.

In contrast to DS_n , the row stochastic single eigenvalue problem (equivalent to the non-negative single eigenvalue problem [Johnson et al., 2018]), is understood (see [Karpelevich, 1951], [Dmitriev and Dynkin, 1946], [Ito, 1997], [Johnson and Paparella, 2017]). We refer to the region of eigenvalues achievable by row stochastic matrices as the Karpelevich region and denote it by K_n . Of course, this larger subset of the unit disc also includes the k -th roots of unity, $k \leq n$ (which are the only points on the unit circle); between consecutive roots of unity, an in-bending algebraic curve excludes a portion of the unit disc. Moreover, these curves follow an eigenvalue of a matrix on the line segment joining two simple row stochastic matrices

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¹We include codes for running experiments and recreating figures in this paper in the following repository: <https://github.com/cptq/ds-spectra>

[Johnson and Paparella, 2017]. We conjecture that the boundary of DS_n (a set star-shaped from any $s \in [0, 1]$) is determined by the eigenvalue paths resulting from the convex combinations of pairs of permutation matrices. Any doubly stochastic matrix is a convex combination of permutation matrices [Birkhoff, 1946], and in fact, as is clear by convexity theory, any n -by- n doubly stochastic matrix is a convex combination of at most $(n - 1)^2 + 1$ permutation matrices [Marcus and Ree, 1959].

Here, we present the Boundary Conjecture, which states that every complex number on the boundary of DS_n is achieved as an eigenvalue of some doubly stochastic matrix that is a convex combination of two or fewer permutation matrices. Assuming this conjecture true significantly reduces the problem size of computing DS_n to a given precision, and allows us to design algorithms much more efficient than naive methods for doing so. There is much theoretical evidence to support our conjecture; our purpose here is to give further computational evidence for our conjecture and to show through computation that, if it is correct, then it is likely that $DS_n = PM_n$ for $n = 6, 7, 8, 9, 10$ and 11 . Moreover, we investigate the exceptional $n = 5$ case in detail. We find that the known example outside PM_5 is an eigenvalue of a matrix on the line segment joining two permutations and that a conjugate pair of eigenpaths are, up to uniform permutation similarity of the pair of permutation matrices generating it, the only paths arising from two permutations that leave PM_5 .

2 Preliminaries and Notation

We begin by stating Birkhoff's Theorem—a fundamental theorem underlying much of the study of doubly stochastic matrices [Birkhoff, 1946]. Denote the convex hull of a set S by $Co(S)$.

Theorem 2.1 (Birkhoff). *$A \in M_n$ is doubly stochastic if and only if it is a convex combination of n -by- n permutation matrices:*

$$\Omega_n = Co(\{P \in M_n : P \text{ a permutation matrix}\})$$

Now, we prove some fundamental properties of DS_n . Much of this was shown in [Perfect and Mirsky, 1965], though we shall need the results and for the most part present some different proofs in hopes of inspiring new perspectives in which to study this difficult problem. In particular, we use some basic concepts from representation theory and do not use the Perron-Frobenius theory of nonnegative matrices.

First, observe that DS_n is contained in the unit disc, due to the properties that the spectral radius is bounded by the spectral norm, convexity of the spectral norm and the fact that all permutation matrices have spectral norm 1 [Horn and Johnson, 2013]. Moreover, observe that the permutation matrices share a common eigenvalue 1 with eigenvector e , the all-ones vector. Thus, the technique of deflation can be used to reduce the problem size. We choose a deflating matrix with inverse of the following form:

$$S = \begin{bmatrix} 1 & 0 \\ e & I_{n-1} \end{bmatrix} \quad S^{-1} = \begin{bmatrix} 1 & 0 \\ -e & I_{n-1} \end{bmatrix} \quad (1)$$

so that multiplication by S and its inverse can be done in linear time. Then we note that for any permutation matrix P , applying similarity by S gives

$$S^{-1}PS = \begin{bmatrix} 1 & * \\ 0 & P' \end{bmatrix}$$

where $P' \in M_{n-1}$ is a (not generally nonnegative) matrix, that has the same multiset of eigenvalues as P , with the eigenvalue 1 having a singly decremented multiplicity.

Lemma 2.2. For any matrices $A_1, \dots, A_k \in M_n$ and nonsingular $S \in GL_n$, the eigenvalues of any linear combination of the A_i are the same as those of the corresponding linear combination of the SA_iS^{-1} .

Proof. $\sum_i \alpha_i A_i$ is similar to $S(\sum_i \alpha_i A_i)S^{-1} = \sum_i \alpha_i SA_iS^{-1}$ □

For any convex combination of permutations, $\sum_i \alpha_i P_i$ has the same eigenvalues as $\sum_i \alpha_i S^{-1} P_i S$, which has as lower right block the matrix $\sum_i \alpha_i P'_i$. The set of all P' is called the standard representation of S_n , and is an irreducible representation of dimension $n-1$. Note that any eigenvalue λ of a doubly stochastic matrix A that is not equal to 1 is thus an eigenvalue of the corresponding lower right block matrix of $S^{-1}AS$. Moreover, the eigenvalue 1 is obviously achieved in the convex hull of the standard representation as an eigenvalue of say I_{n-1} . Thus, we have the following lemma:

Lemma 2.3. DS_n equals the region achieved by eigenvalues of the matrices in the convex hull of the standard representation of S_n .

A region $D \subseteq \mathbb{C}$ of the complex plane is *star-shaped* from a point $s \in \mathbb{C}$ if for all points $x \in D$, the line segment $\{\alpha x + (1 - \alpha)s : \alpha \in [0, 1]\}$ is contained in D . It was shown in [Perfect and Mirsky, 1965] that DS_n is star-shaped from 0—we will prove a slightly stronger statement.

Lemma 2.4. If the scalar matrix sI is in the convex hull $Co(\mathcal{F})$ of a family of matrices $\mathcal{F} \subseteq M_n$, then the region of eigenvalues $\{\lambda : \lambda \in \sigma(A), A \in Co(\mathcal{F})\}$ is star-shaped from s .

Proof. If λ is an eigenvalue of $A \in Co(\mathcal{F})$, then since $\alpha A + (1 - \alpha)sI$ is in $Co(\mathcal{F})$ for $\alpha \in [0, 1]$, we have that the eigenvalue $\alpha\lambda + (1 - \alpha)s$ of this matrix is in the region of eigenvalues. □

Corollary 2.5. DS_n is star-shaped from any point in $[0, 1]$ for $n \geq 2$.

Proof. The standard representation of S_n contains the identity I_{n-1} . Moreover, the average of the elements of the standard representation, $\frac{1}{n!} \sum_i P'_i$ is in the convex hull of the standard representation and is in fact equal to 0, since the sum of all elements of any nontrivial irreducible representation is equal to 0. Thus, all scalar matrices sI for $s \in [0, 1]$ are in the convex hull and Lemma 2.4 allows us to draw the stated conclusion. □

The following lemmas are useful for our computations and provide simple quantitative measures of how close DS_n is to filling the entire unit disc—in the limit DS_n fills the interior of the unit disc and a dense subset (consisting of roots of unity) of the unit circle.

Lemma 2.6. The circle of radius $\cos(\frac{\pi}{n})$, centered at the origin, is contained in DS_n for $n > 2$.

Proof. This is simply the circle inscribed in Π_n , which contains the circles inscribed in Π_k for $k < n$. □

Lemma 2.7. $PM_n = \cup_{k \leq n} \Pi_k \subseteq DS_n$

Proof. A permutation matrix A that is a k -cycle has minimal polynomial $x^k - 1$. Any convex combination $\alpha_0 I + \alpha_1 A + \dots + \alpha_{k-1} A^{k-1}$ is a polynomial in A with eigenvalues $\alpha_0 + \alpha_1 \lambda + \dots + \alpha_{k-1} \lambda^{k-1}$, where λ is an eigenvalue of A . Since ξ , a primitive k th root of unity, is an eigenvalue of A , $\Pi_k = Co(1, \xi, \dots, \xi^{k-1})$ is contained in DS_n . □

Now, we formally state the Boundary Conjecture.

Conjecture 2.8 (Boundary Conjecture). Pairs of permutation matrices determine the boundary of DS_n . That is, every point of the boundary of DS_n is an eigenvalue of some convex combination of at most two permutation matrices.

If this conjecture were true, then by Corollary 2.5, the star-shapedness of DS_n gives

Conjecture 2.9. Every complex number in DS_n is achieved as an eigenvalue of a convex combination of three or fewer permutations. More specifically, convex combinations of the form

$$\alpha_1 P + \alpha_2 Q + (1 - \alpha_1 - \alpha_2)I \quad P, Q \text{ permutations, } \alpha_1, \alpha_2 \geq 0, \alpha_1 + \alpha_2 \leq 1$$

achieve every eigenvalue in DS_n .

There is much evidence to suggest that the boundary of DS_n is determined by pairs of permutations. For any n such that $DS_n = PM_n$, this is true. This is due to the fact that, as can be seen by the reasoning in the proof of Lemma 2.7, any edge of Π_k is attained by eigenvalues along a suitable pair of a k -cycle and one of its powers. Moreover, any doubly stochastic matrix that has all eigenvalues of magnitude 1 is in fact a permutation matrix [Perfect and Mirsky, 1965], so in this sense the matrices with the most extremal eigenvalues are the permutation matrices. Perhaps taking convex combinations of more permutations matrices has an averaging effect on the eigenvalues. In fact, in the standard representation, taking the average over all group elements gives the zero matrix (since it is an irreducible representation), which has all 0 eigenvalues that are as far into the interior of DS_n as possible. Further, the Karpelevich region consisting of all eigenvalues achievable by row stochastic matrices has boundary determined by convex combinations of pairs of certain row stochastic matrices [Johnson and Paparella, 2017]. Lastly, our computations have not found any eigenvalue on the boundary of DS_n that does not belong to a convex combination of pairs of permutations.

In language and notation, we use the standard correspondence between permutations $\sigma \in S_n$ with matrices $P \in M_n$, where the matrix associated with σ has entries $P_{ij} = 1$ if $\sigma(i) = j$ and 0 otherwise. Moreover, we use standard cycle notation for permutations, and say a permutation in S_n has cycle type n_1, \dots, n_k if it has disjoint cycles of length n_1, \dots, n_k and $\sum_i n_i = n$. Two sets of matrices $\mathcal{F}, \mathcal{F}' \subseteq M_n$ are *uniformly similar* if there exists nonsingular S such that $\mathcal{F} = \{SAS^{-1} : A \in \mathcal{F}'\}$. If S can be taken to be a permutation matrix we say that the sets are *uniformly permutation similar*. We make the analogous definition for sets of permutations in S_n to be *uniformly conjugate*.

Even though Perfect and Mirsky did not explicitly make such a statement in their original paper [Perfect and Mirsky, 1965], we refer to the Perfect-Mirsky conjecture for a given n as the conjecture that $DS_n = PM_n$.

3 The Computational Approach and Inequivalent Pairs

In later sections we discuss some of the computational evidence that supports the Boundary Conjecture. In this section, we outline the computational approach to obtaining such evidence as well as information about DS_n for $n \geq 5$. We search for counterexamples to the Perfect-Mirsky conjecture by computing the eigenvalues of those doubly stochastic matrices that are convex combinations of pairs of permutations. If the conjecture is true, then for any n where $PM_n \neq DS_n$, there will exist an eigenvalue in DS_n outside of PM_n that comes from a pair of permutations, so that this approach will find a counterexample if the precision is taken fine enough. This approach dramatically reduces the problem size, and makes tractable the computation of DS_n to reasonable precision for higher n . To control precision, we choose a *mesh size*, meaning the number of matrices along a convex combination of two matrices whose eigenvalues we compute. For instance, for a mesh size of 11, and for a pair of permutations P and Q , we compute eigenvalues of $P, \frac{9}{10}P + \frac{1}{10}Q, \dots, \frac{1}{10}P + \frac{9}{10}Q, \text{ and } Q$

There are $O(\binom{n!}{2}) = O((n!)^2)$ pairs of permutations to consider. This can be significantly reduced with the following two lemmas. For each cycle type of S_n , choose a representative permutation matrix C of that cycle type that is a direct sum of cyclic permutation matrices

(in descending order of length). We call such a C the *canonical cycle form* of any permutation matrix representing a permutation of the same cycle type.

Lemma 3.1. *Every pair of permutations P_1, P_2 is uniformly similar to a pair of permutations C, R , in which C is the canonical cycle form of P_1 .*

Proof. Since C is of the same cycle type as P_1 , we can choose a permutation matrix Q that conjugates P_1 to C . Then $C = QP_1Q^T$ and $R = QP_2Q^T$ gives the desired pair of permutations. \square

This is useful in view of Lemma 2.2 and the following basic lemma.

Lemma 3.2. *Two permutation matrices are similar if and only if they are similar by a permutation similarity.*

Proof. All permutation matrices are diagonalizable, being representations of S_n . Thus, two permutation matrices are similar if and only if they have the same multiset of eigenvalues. The multiset of eigenvalues is determined by cycle-type, and two permutation matrices are similar by a permutation similarity if and only if they have the same cycle-type. \square

Thus, to compute the eigenvalues that are achievable by convex combinations of any pairs of permutation matrices, we need only consider eigenvalues achievable by convex combinations of each cycle type's canonical form with other permutation matrices. There are $p(n) \cdot n!$ such pairs, in which $p(n)$, the number of partitions of size n , counts the number of cycle types of permutations of size n . This also provides a simple reduction for convex combinations of more than two permutation matrices—for three matrices, $O(p(n) \cdot (n!)^2)$ triples need to be computed if we consider triples consisting of each cycle type's canonical form and two other permutations in S_n .

In fact, the number of pairs to be considered can be reduced further with more precise utilization of uniform permutation similarity. For any pairs of permutations that are equal up to uniform conjugation, we need only consider one representative pair due to Lemma 2.2. Consider the group $S_n \times S_n$, the direct product of the symmetric group with itself, and the action of diagonal conjugation on this group by S_n —meaning that the permutation p acts on (σ, τ) by $(\sigma, \tau)^p = (p\sigma p^{-1}, p\tau p^{-1})$. Then we need only consider one representative pair from each orbit of this action on $S_n \times S_n$. Here we introduce some necessary concepts from group theory that we use to derive a computationally feasible method to obtain such representative pairs. See [Bouc, 2000] for a reference for definitions and results.

A G -set is a set with a group action by a group G . Two G -sets X and Y are isomorphic, denoted $X \cong Y$, if there is a bijection $f : X \rightarrow Y$ such that $f(g \cdot x) = g \cdot f(x)$. Let \bigsqcup denote the disjoint union operation on G -sets, and let $X \times Y$ denote the product of two G -sets, meaning the G -set that is the set given by the regular cartesian product of X and Y along with the action $g \cdot (x, y) = (g \cdot x, g \cdot y)$. For a subset $S \subseteq G$, let $\mathcal{O}(x)$ denote the orbit of an element x under the action of conjugation on S by G , $C_G(x)$ denote the centralizer in G of an element x , and \mathcal{C} denote a set of representatives of each conjugacy class of G . Then we have the following isomorphisms of G -sets by basic properties of orbit-stabilizer relationships and distributivity:

$$\begin{aligned} G \times G &\cong \left(\bigsqcup_{x \in \mathcal{C}} \mathcal{O}(x) \right) \times \left(\bigsqcup_{y \in \mathcal{C}} \mathcal{O}(y) \right) \\ &\cong \left(\bigsqcup_{x \in \mathcal{C}} G/C_G(x) \right) \times \left(\bigsqcup_{y \in \mathcal{C}} G/C_G(y) \right) \\ &\cong \bigsqcup_{x \in \mathcal{C}} \bigsqcup_{y \in \mathcal{C}} (G/C_G(x)) \times (G/C_G(y)) \end{aligned}$$

Now, for subgroups $H, K \leq G$, define the double coset $HgK = \{h g k : h \in H, k \in K\}$ for $g \in G$, the double coset space $H \backslash G / K = \bigcup_{g \in G} HgK$, and for any choice of representatives of each double coset in $H \backslash G / K$ denote the set of all representatives by $[H \backslash G / K]$. We will make use of Mackey's formula for G -sets, which can be found in [Bouc, 2000]:

$$(G/H) \times (G/K) \cong \bigsqcup_{g \in [H \backslash G / K]} G / (H \cap gKg^{-1})$$

Applying Mackey's formula with $H = C_G(x)$ and $K = C_G(y)$ gives us that

$$\begin{aligned} G \times G &\cong \bigsqcup_{x \in \mathcal{C}} \bigsqcup_{y \in \mathcal{C}} \bigsqcup_{g \in [C_G(x) \backslash G / C_G(y)]} G / (C_G(x) \cap gC_G(y)g^{-1}) \\ &\cong \bigsqcup_{x \in \mathcal{C}} \bigsqcup_{y \in \mathcal{C}} \bigsqcup_{g \in [C_G(x) \backslash G / C_G(y)]} G / (C_G(x) \cap C_G(gyg^{-1})) \end{aligned}$$

Thus, with $G = S_n$, the representative pairs from the orbits of the action of diagonal conjugation on $S_n \times S_n$ are in one-to-one correspondence with the tuples (x, y, g) , where x and y are representatives of conjugacy classes of S_n and g is a representative of the double cosets of $C_G(x)$ and $C_G(y)$. Since the eigenvalues of convex combinations of (σ, τ) are equal to those of (τ, σ) , we need only consider about half of these representative pairs. We define a relation on the set of pairs of permutations, where two pairs (σ_1, τ_1) and (σ_2, τ_2) are related if they are uniformly permutation similar to each other, or if they are uniformly permutation similar after a reversal of one, meaning $(\sigma_1, \tau_1)^p = (\tau_2, \sigma_2)$ for some $p \in S_n$. It can be seen that this relation is an equivalence relation—we call the distinct equivalence classes *inequivalent pairs*.

There exist double-coset representative enumeration algorithms due to the study of computational group theory which we can take advantage of in our computation of the inequivalent pairs. We use routines from the GAP computer algebra system for double-coset representative enumeration and centralizer computations [GAP, 2019]. Algorithm 1 is our algorithm for determining the inequivalent pairs.

Algorithm 1 Compute Inequivalent Pairs

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1: for  $\sigma$  one representative of cycle type  $i \in \{1, \dots, p(n)\}$  do
2:   for  $\tau$  one representative of cycle type  $j \in \{i, \dots, p(n)\}$  do
3:     Compute centralizers  $C_G(\sigma)$  and  $C_G(\tau)$ 
4:     Compute representatives of double cosets  $[C_G(\sigma) \backslash G / C_G(\tau)]$ 
5:     for  $g$  in  $[C_G(\sigma) \backslash G / C_G(\tau)]$  do
6:       Add  $(\sigma, g\tau g^{-1})$  to pairsList
7:     end for
8:   end for
9: end for
10: return pairsList

```

In Table 1 we list the number of inequivalent pairs in comparison to $p(n) \cdot n!$, the number of pairs considered under our initial method without this reduction. Let $a(n)$ be the number of equivalence classes of pairs in $S_n \times S_n$, where uniformly conjugate pairs are equivalent (this is also the number of orbits in $S_n \times S_n$ under the action of uniform conjugation by S_n), and $b(n)$ the number of such classes where any representative of the class is a pair (σ, τ) where σ and τ have the same cycle type. Then the number of inequivalent pairs is exactly $(a(n) + b(n))/2$. $a(n)$ is known to grow at $O(n!)$ [OEIS, 2019], so the number of inequivalent pairs also grows at $O(n!)$. Thus the difference is substantial between the number of pairs considered with the naive method and the number of inequivalent pairs. Since Algorithm 1 computes the inequivalent

pairs quickly for $n \leq 12$, we find it makes a major difference in our computation. Compared to computing the pairs of canonical cycle types with permutations, computing only eigenvalues for inequivalent pairs saves time and memory, so this reduction is useful for both searching for counterexamples and plotting in fine mesh sizes.

n	inequivalent pairs	$p(n) \cdot n!$
2	3	4
3	8	18
4	28	120
5	98	840
6	518	7,920
7	3,096	75,600
8	23,415	887,040
9	201,795	10,886,400
10	1,973,189	152,409,600
11	21,347,935	2,235,340,800
12	253,282,652	36,883,123,200
13	3,263,902,430	628,929,100,800

Table 1: Number of inequivalent pairs compared to $p(n) \cdot n!$, where p is the partition function.

Now, we discuss other details of our computations of DS_n . Since doubly stochastic matrices have real elements, their complex eigenvalues come in conjugate pairs, so we only consider those in the upper half plane. Moreover, since $\Pi_2 = [-1, 1]$ is always included in DS_n for $n \geq 2$, we need not consider any real eigenvalues since all of them are accounted for. Similarly, using the deflation as in Lemma 2.3, only $n - 1$ by $n - 1$ matrices need to be handled to compute DS_n as the shared eigenvalue of 1 can be deflated away by the matrix in (1). To determine whether an eigenvalue λ is within the region, we first use Lemma 2.6 to see that any eigenvalue λ with magnitude $|\lambda| \leq \cos(\frac{\pi}{n})$ cannot be an exception to Perfect-Mirsky. Otherwise, for each $k \leq n$ we check which vertices of Π_k are the ones that $\text{Re}(\lambda)$ lies between, by checking which of the intervals $[\cos(\frac{2\pi j}{k}), \cos(\frac{2\pi(j+1)}{k})]$ is the one that contains $\text{Re}(\lambda)$. Then we check whether $\text{Im}(\lambda)$ satisfies the linear inequality determined by $\text{Re}(\lambda)$ and j that defines this side of the polygon Π_k .

4 Examination of DS_5

In [Mashreghi and Rivard, 2007], the following 5-by-5 doubly stochastic matrix was noted to have eigenvalues outside of PM_5 for $t \in [.49, .51]$:

$$\begin{bmatrix} 0 & 0 & 0 & 1 & 0 \\ 0 & 0 & t & 0 & 1-t \\ 0 & t & 1-t & 0 & 0 \\ 0 & 1-t & 0 & 0 & t \\ 1 & 0 & 0 & 0 & 0 \end{bmatrix}$$

We note that that these matrices are given by convex combinations of pairs of matrices, corresponding to

$$t \begin{bmatrix} 0 & 0 & 0 & 1 & 0 \\ 0 & 0 & 1 & 0 & 0 \\ 0 & 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 1 \\ 1 & 0 & 0 & 0 & 0 \end{bmatrix} + (1-t) \begin{bmatrix} 0 & 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 0 & 0 \\ 0 & 1 & 0 & 0 & 0 \\ 1 & 0 & 0 & 0 & 0 \end{bmatrix}$$

in which the two permutations matrices correspond to $(145)(23)$ and (1425) respectively. Using high-precision arithmetic, we have computed that the range of convex coefficients t for which the exceptional eigenpath of this matrix has eigenvalues outside PM_5 is about $[.4705275, .5490013]$. The exceptional curve in the upper half plane connects a third root of unity at $e^{2\pi i/3}$ with a fourth root of unity at i . It leaves PM_5 near the intersection of Π_3 with Π_4 and barely stays within PM_5 near the intersection of Π_4 and Π_5 . See Figures 2 and 4 for images of this curve. Moreover, we note that only one other eigenpath is close to the boundary of PM_5 . This path is given by a pairing between (1425) and (12345) .

The pair of cycle types for the two permutations that generate the exceptional curve are of note. This exception is present in DS_5 , and does not include a 5-cycle. Instead, the element of the pair that is present in S_5 but not in S_4 is of type 2,3. The following is an important observation that demonstrates why this curve is truly exceptional.

Observation 4.1. There is only one inequivalent pair, up to uniform permutation similarity, that generates an eigenvalue outside of PM_5 .

Take the original exceptional pair $(145)(23)$ and (1425) . We determine the inequivalent pair classes of this pairing of cycle types 2,3 with 1,4. Without loss of generality, we can fix (1425) , since if we want to determine the class of a pair with another 4-cycle, we can first take a uniform conjugacy to shift it to a pair with (1425) . Thus, any further conjugation must be by an elements of $C_{S_n}((1425)) = \langle (1425) \rangle$, the centralizer of (1425) . We can view the inequivalent pair classes of this pairing of cycle types as the orbits of the action of $C_{S_n}((1425))$ on the set \mathcal{B} of elements of cycle type 2,3 by conjugation. The stabilizer of the action for any $\tau \in \mathcal{B}$ is trivial due to the cycle structures, so there are precisely $|\mathcal{B}|/|C_{S_n}((1425))| = 20/4 = 5$ orbits. Computing the eigenpaths of pairings $(r, (1425))$, where r is a representative of each orbit, we find that only the inequivalent pair class of the original counterexample gives an eigenpath that leaves PM_5 ; in fact, all of the eigenpaths from other inequivalent pair classes stay well inside PM_5 . Lastly, since the exceptional curve goes from a third root of unity to a fourth root of unity, we check pairings of (1425) with 3-cycles (there are again 5 inequivalent pair classes) and again find that no path even comes close to leaving PM_5 .

In Table 2, we list the inequivalent pair classes of pairings of permutations of cycles types 2,3 with 1,4. Understanding the differences between the inequivalent pair classes of pairs of these cycle types may be essential to understanding why the exceptional pair of permutations leaves PM_5 .

Class	2,3 type Permutations of Class
1	$(34)(125), (35)(142), (23)(145), (13)(254)$
2	$(12)(345), (12)(354), (45)(132), (45)(123)$
3	$(35)(124), (34)(152), (13)(245), (23)(154)$
4	$(24)(135), (15)(234), (25)(143), (14)(253)$
5	$(25)(134), (14)(235), (15)(243), (24)(153)$

Table 2: Inequivalent pair classes and all representatives of each class with respect to pairing a 2,3 permutation with (1425) . To determine which inequivalent pair class a general pair (σ, τ) corresponds to, where σ has type 2,3 and τ has type 1,4, uniformly conjugate $(\sigma, \tau)^p$ by a $p \in S_n$ which conjugates τ to (1425) , then check which row of the table $p\sigma p^{-1}$ is contained in. Note that the exceptional pair is in class 1.

Furthermore, we have computed convex combinations of triples of permutations in Ω_5 to a mesh size of 200 and for quadruples at a mesh size of 43. For a mesh size of m in the case of k -tuples, we mean that for every k -tuple of permutations considered, we take m weights of size $1/m$ and compute eigenvalues for every possible distribution of these weights among the k permutations. Thus, per triple of permutations, we compute eigenvalues for $O(m^2)$ matrices,

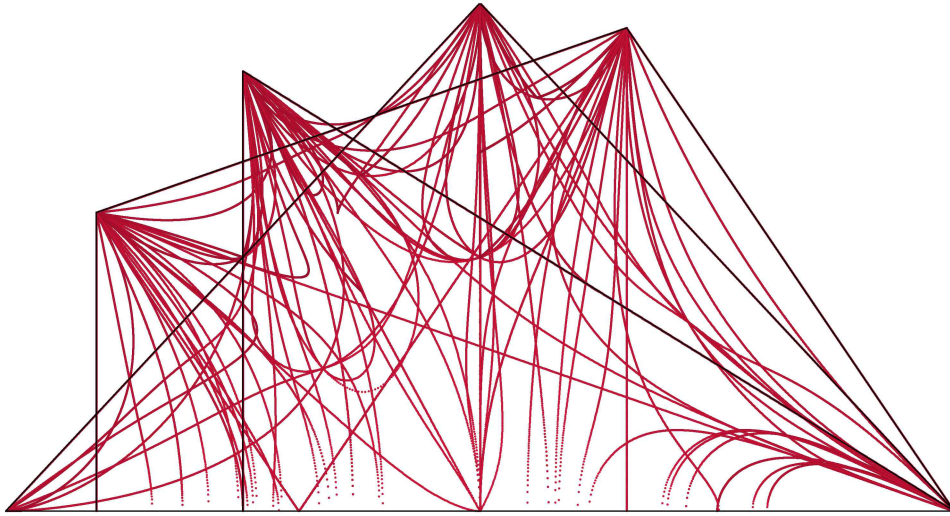


Figure 1: Inequivalent pairs for DS_5 . The boundaries of Π_k for $k \leq 5$ are outlined in black. Eigenvalues of inequivalent pairs are in red. Only the upper half plane is shown due to the symmetry of DS_n across the real line.

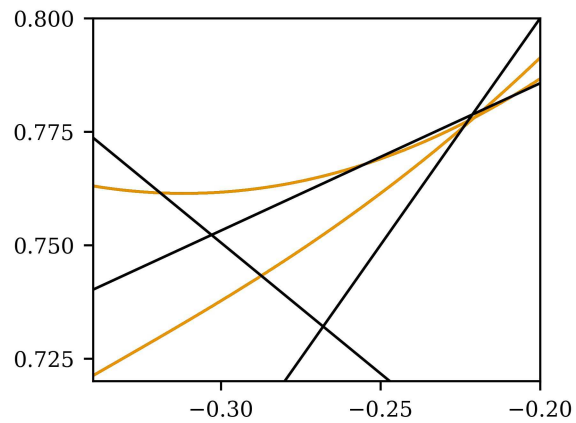


Figure 2: Close-up of exceptional curve in DS_5 , along with other pair (1234) that comes close to leaving PM_5 , both in orange. PM_5 is in black as per usual. The exceptional curve leaves PM_5 above the intersection of Π_3 and Π_5 .

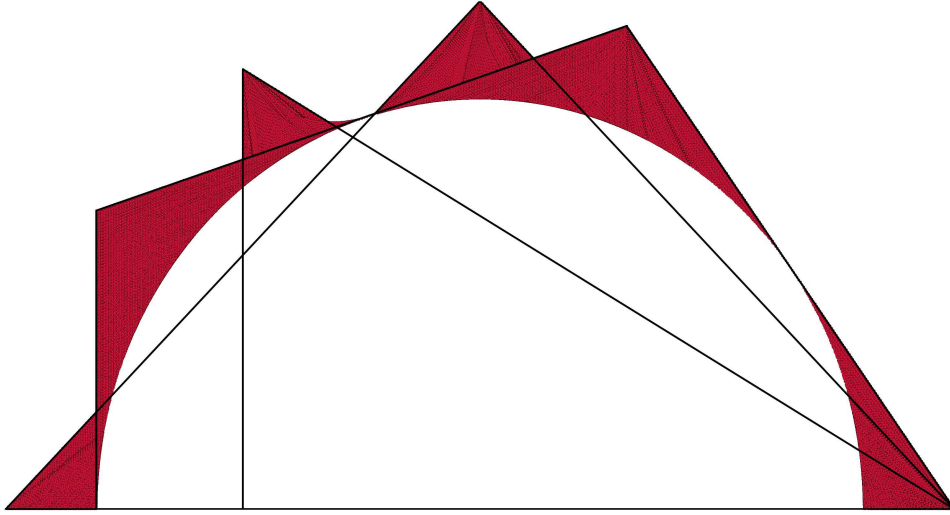


Figure 3: Eigenvalues of triples of permutations for DS_5 . The inscribed circle is omitted.

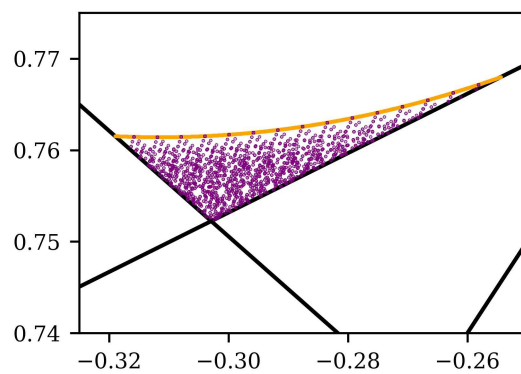


Figure 4: Close-up of subset of DS_5 generated by triples. Eigenvalues of triples are in purple while the exceptional curve is in orange. Only those points outside of PM_5 are plotted. No eigenvalues of triples extend beyond the exceptional curve that is generated by pairs.

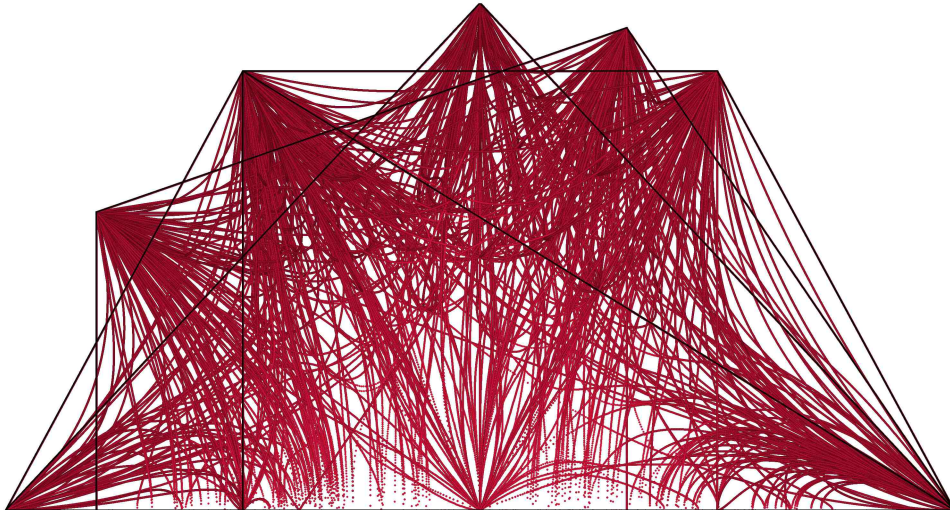


Figure 5: Inequivalent pairs for DS_6 . Π_k for $k \leq 6$ outlined in black.

as opposed to the $O(m)$ matrices computed along each pair. As shown in Figures 3 and 4, no eigenvalues of triples leave the region interior to the eigenvalues of pairs. Likewise, no eigenvalues of quadruples leave this region. This supports the Boundary Conjecture.

5 Computational Results

Our experiments have found no counterexamples to the Perfect-Mirsky conjecture for any $n \neq 5$. More specifically, there are no counterexamples along convex combinations of pairs of permutations for mesh size choices of $m = 10000$ for $n = 6, 7, 8, 9$, $m = 1000$ for $n = 10$, and $m = 200$ for $n = 11$. Recall that the exceptional curve for $n = 5$ lies outside of PM_5 for convex coefficients in an interval of length greater than .07, and counterexamples can be found with coarse mesh sizes—any mesh size larger than 14 suffices to find one but we also note that any odd mesh size contains $1/2$ as a choice of convex coefficient and thus by chance happens to find a counterexample. Hence, the mesh sizes that we used for these computations for pairs with higher n seem well-beyond sufficiently fine. However, we also note that it is reasonable to expect finer mesh sizes to be necessary for finding counterexamples for larger n , as PM_n takes up more space in the unit disc and the absolute distance by which any exceptional curve leaves the region might be smaller.

In Figures 5 and 6 we plot the (eigenvalues of) inequivalent pairs for DS_6 and DS_7 . Every curve is quite far from leaving the boundary of PM_n , unlike the $n = 5$ case, in which besides the exceptional curve, there was another curve quite close to the boundary of PM_5 . Likewise, in plotting pairs for DS_8 and DS_9 , there are no curves that are close to leaving PM_n . It is difficult to obtain information from plots of DS_{10} since the margin between PM_{10} and the unit disc is lower and also since the high number of points makes plotting at a high mesh size difficult. We computed some triples for $n \leq 11$ at various mesh sizes, and, as expected, due to the distance that pairs were from the the boundary of PM_n for $n \leq 11$, found that there were no counterexamples to Perfect-Mirsky for these n .

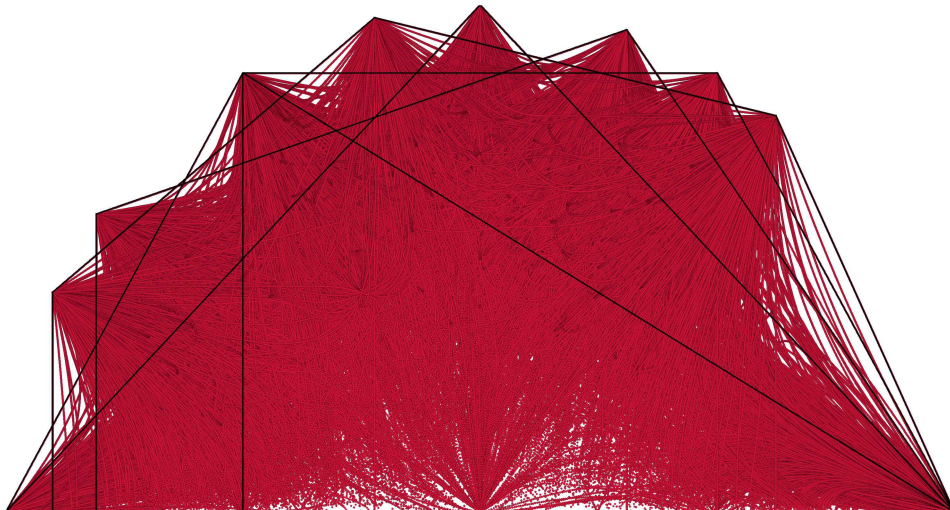


Figure 6: Inequivalent pairs for DS_7 . Π_k for $k \leq 7$ outlined in black.

6 Spectra of Convex Hulls of Matrix Groups

In [Jankowski et al., 2019], the authors consider the so-called *hull spectra* of matrix groups, defined for a matrix group G as

$$HS(G) := \{\lambda : \lambda \in \sigma(A), A \in Co(G)\}$$

Note that $DS_n = HS(G)$ when G is the group consisting of the n -by- n permutation matrices. They determined the hull spectra for abelian matrix groups, all representations of the dihedral group, and all representations of the quaternion group. In all of the cases in which the groups under consideration were finite, the boundary of the hull spectrum was achieved by eigenvalues from convex combinations of pairs of group elements. For infinite abelian groups, there is a possibility that the hull spectrum contains a set that is the interior of the unit disc together with a dense subset of the unit circle. In this case, pairs achieve all values of the boundary of the hull spectrum that are actually part of the hull spectrum i.e. the set $\partial HS(G) \cap HS(G)$. In any other case with infinite abelian groups, pairs determine the boundary.

However, it should be noted that we have found exactly two groups in which pairs do not determine the boundary of the hull spectrum. These two groups are A_4 and A_5 in the standard representation, and A_n in the standard representation for higher n may also have this property. The exact forms of A_1, A_2 and A_3 are trivial to determine (they are $\{1\}, \{1\}$, and Π_3 respectively), and obviously have pairs determining the boundary. However, for A_4 and A_5 , some eigenvalues obtained by convex combinations of triples of even permutations are not within the region interior to the eigenvalues achieved by convex combinations of pairs. See Figures 7 and 8 for visualization of these phenomena.

While the fact that the several classes of groups considered in [Jankowski et al., 2019] with known hull spectra have boundary determined by pairs does support the Boundary Conjecture, it is somewhat worrying that the standard representations of A_4 and A_5 , which are of course closely related to the standard representations of S_4 and S_5 , provide exceptions to the analogous conjecture for general matrix groups. However, we do believe that our arguments in Section 3 are still strong, and that along with the computational evidence that we have produced, suggests to us that the Boundary Conjecture is likely to be true.

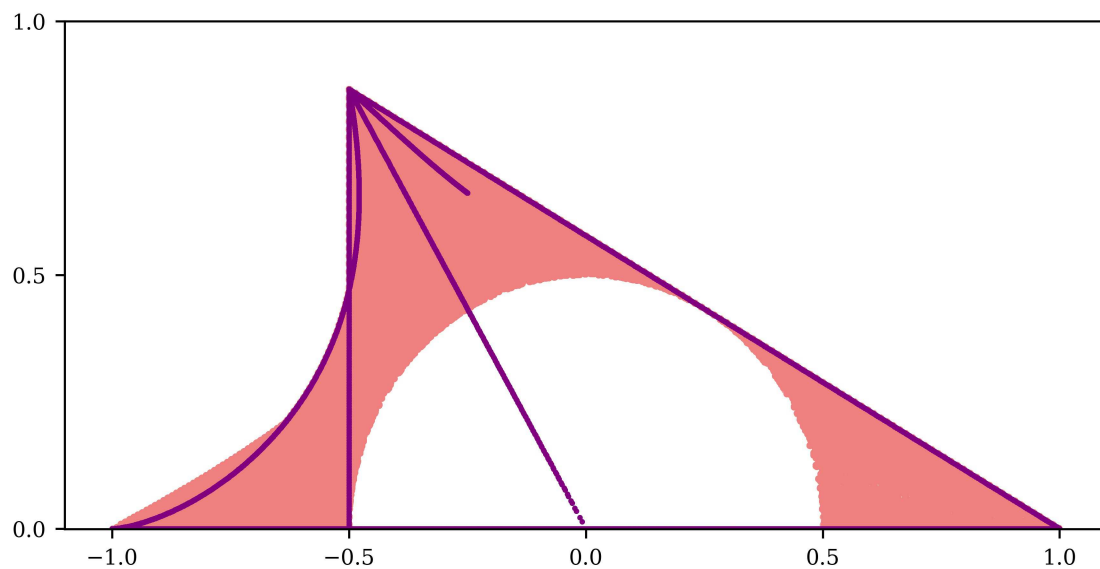


Figure 7: Eigenvalues of convex combinations of pairs and triples of 4-by-4 even permutation matrices. Pairs are in purple, and triples are in pink.

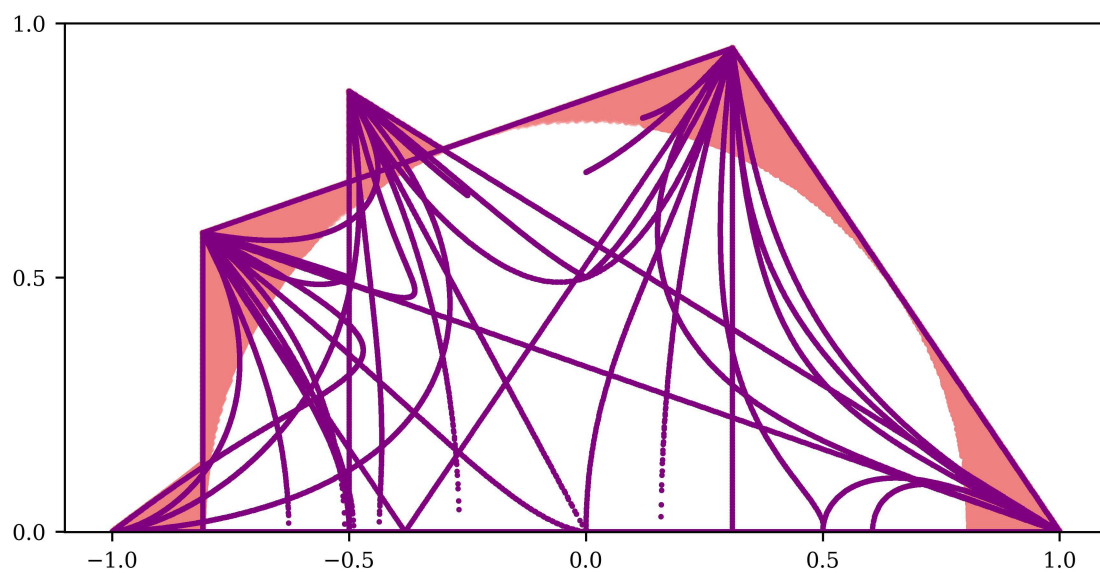


Figure 8: Eigenvalues of convex combinations of pairs and triples of 5-by-5 even permutation matrices. Pairs are in purple, and triples are in pink.

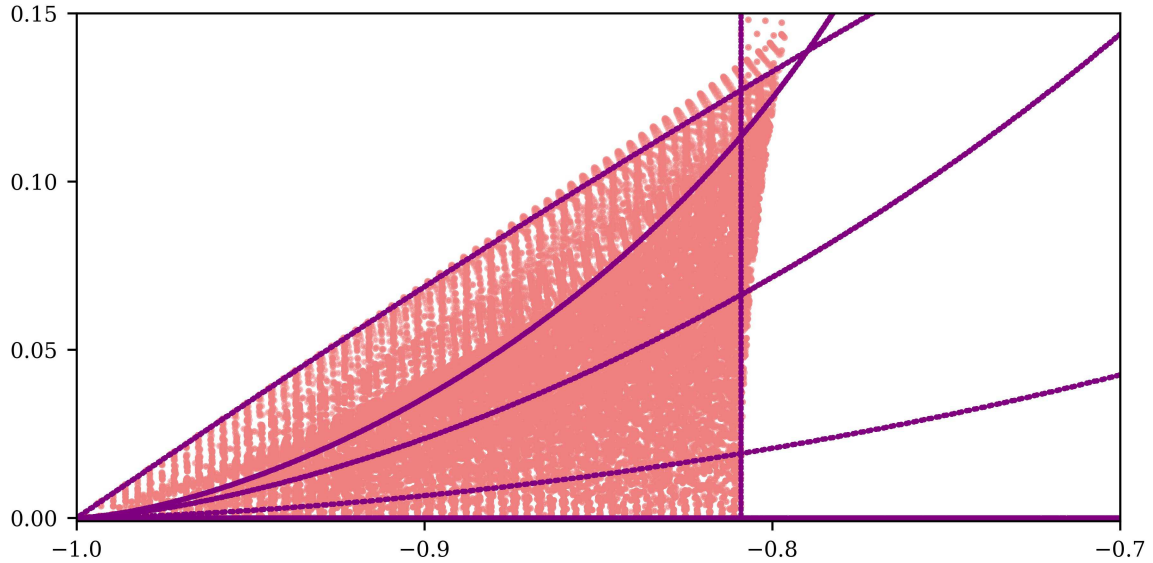


Figure 9: Zoomed in version of Figure 8.

7 Further Discussion and Conclusion

In [Levick et al., 2014], it was conjectured that DS_n is the union $PM_n \cup K_{n-1}$. While this does hold for $n \leq 4$, since K_{n-1} for such n coincides with DS_{n-1} , our computations suggest that this is false in general. Our computations for triples in DS_n for $n \geq 6$ show that there are no eigenvalues that leave PM_n , let alone come close to the arcs that form the boundary of the corresponding Karpelevich regions. For $n = 5$, the exceptional curve stays well within the Karpelevich region K_4 , and we do not find eigenvalues that leave PM_5 in other regions where K_4 extends beyond PM_5 . See Figures 10 and 11 for visualizations of $PM_n \cup K_{n-1}$ for $n = 5, 6$. In fact, we believe in a stronger inclusion for certain n that we have sufficiently computed. Our computational evidence, as outlined above, is consistent with the Perfect-Mirsky conjecture for certain n , so we make the following conjecture:

Conjecture 7.1. $DS_n = PM_n$ for $n = 6, 7, 8, 9, 10$ and 11 .

If the Boundary Conjecture is true, there would be little doubt in our conjecture due to the fine mesh sizes to which we have computed pairs. If the Boundary Conjecture is not true for some n , then we still believe that this conjecture is likely to be true for the values of n we have discussed, since we have also computed triples for these n and found no counterexamples.

We have spent much CPU time (> 2 years) on searching for exceptions to the Perfect-Mirsky conjecture for larger n , but have not found any. Our other methods for finding counterexamples did not result in any, but are worth noting. Since the original $n = 5$ counterexample occurs as an eigenvalue of the average of two permutations, we checked whether eigenvalues of averages of pairs of permutations gave exceptions to Perfect-Mirsky. Also, we have tried computing eigenvalues of convex combinations of some triples of permutations for $n \leq 11$ and varying mesh sizes, but have not found any counterexamples in this way. The size of this problem of computing DS_n to a given mesh size scales dramatically in n , and for higher-order tuples (beyond pairs) of permutations also scales quickly in the mesh size (recall that for triples, computing on a mesh size of m means computing $O(m^2)$ matrices for each triple as opposed to $O(m)$ for each pair in the two matrix case). Thus, our computations are by no means absolutely comprehensive, but the computational results that we have obtained are consistent with the Perfect-Mirsky conjecture for these n under consideration.

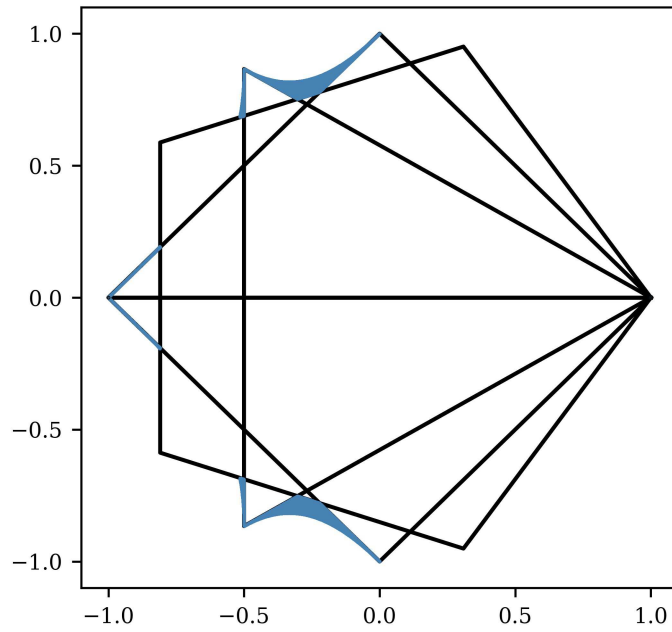


Figure 10: PM_5 in outlined in black and K_4 filled in blue. Only the subset of K_4 that is outside of PM_5 is displayed. See [Swift, 1972] for equations determining K_n for small n .

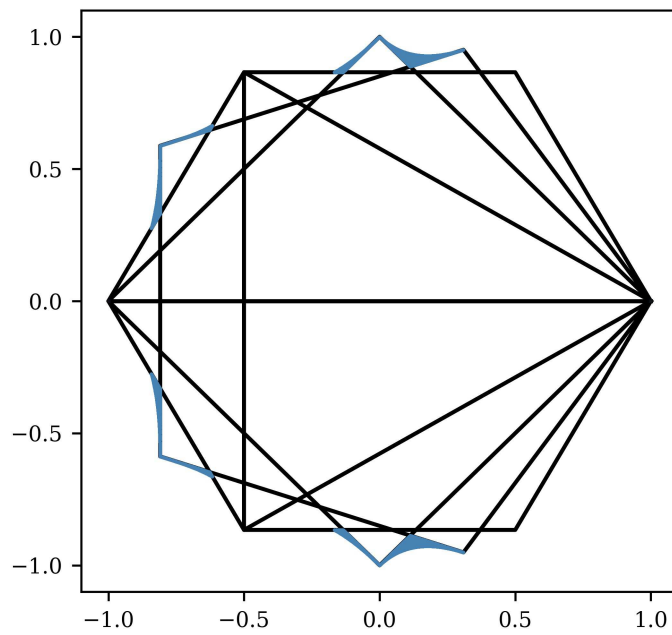


Figure 11: PM_6 in black and K_5 in blue. Again, only the subset of K_5 outside of PM_6 is displayed.

In the future, we hope that researchers with the right tools may find results that determine DS_n for some $n > 4$. We do believe that Perfect-Mirsky holds for $n = 6, 7, 8, 9, 10, 11$, and have presented our computational results that are consistent with this assertion. In both of the works [Perfect and Mirsky, 1965] and [Levick et al., 2014] which made major advances in the study of DS_n , properties of doubly stochastic matrices were used extensively. For the most part, we work directly with the permutations that are the extreme points of the set of doubly stochastic matrices and are still able to deduce properties of DS_n . Algebraic properties of permutations could provide useful information if combined with the properties of doubly stochastic matrices in future study. In DS_5 , the differences in behavior of eigenpaths of different inequivalent pairs are mysterious and likely worth studying.

8 Acknowledgments

This work was performed [in part] using computing facilities at the College of William and Mary, which were provided by contributions from the National Science Foundation, the Commonwealth of Virginia Equipment Trust Fund and the Office of Naval Research.

We would like to thank Jamie Barsotti for assistance with bringing our attention to the relevant theory on G -sets, and for assistance in deriving the algorithm to compute the inequivalent pairs. Also, we would like to thank John Wilkes, who carried out initial work on this problem in his honors thesis at the College of William and Mary advised by Charles R. Johnson [Johnson and Wilkes, 2018].

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References

- [Birkhoff, 1946] Birkhoff, G. (1946). Three Observations on Linear Algebra (Spanish). *Univ. Nac. Tucumán. Revista A.*, 5:147–151.
- [Bouc, 2000] Bouc, S. (2000). Burnside rings. In *Handbook of Algebra*, volume 2, pages 739–804. Elsevier.
- [Dmitriev and Dynkin, 1946] Dmitriev, N. A. and Dynkin, E. (1946). On characteristic roots of stochastic matrices. *Izvestiya Rossiiskoi Akademii Nauk. Seriya Matematicheskaya*, 10(2):167–184.
- [GAP, 2019] GAP (2019). *GAP – Groups, Algorithms, and Programming, Version 4.10.2*. The GAP Group.
- [Horn and Johnson, 2013] Horn, R. A. and Johnson, C. R. (2013). *Matrix Analysis*. Cambridge University Press, New York, NY, second edition.
- [Ito, 1997] Ito, H. (1997). A new statement about the theorem determining the region of eigenvalues of stochastic matrices. *Linear Algebra and its Applications*, 267:241 – 246.
- [Jankowski et al., 2019] Jankowski, E., Johnson, C. R., and Lim, D. (2019). Spectra of convex hulls of matrix groups. In preparation.
- [Johnson et al., 2018] Johnson, C. R., Marijuan, C., Paparella, P., and Pisonero, M. (2018). The NIEP. In C., A., M., B., A., K., B., S., and I., Z., editors, *Operator Theory, Operator Algebras, and Matrix Theory*, volume 267 of *Operator Theory: Advances and Applications*, pages 199–220. Birkhauser, Cham.
- [Johnson and Paparella, 2017] Johnson, C. R. and Paparella, P. (2017). A matricial view of the Karpelevič theorem. *Linear Algebra and its Applications*, 520:1 – 15.

- [Johnson and Wilkes, 2018] Johnson, C. R. and Wilkes, J. (2018). The Doubly Stochastic Single Eigenvalue Problem: An Empirical Approach. <https://scholarworks.wm.edu/honorstheses/1258/>. Honors Thesis at College of William and Mary.
- [Karpelevich, 1951] Karpelevich, F. I. (1951). On the characteristic roots of matrices with non-negative elements. *Izvestiya Rossiiskoi Akademii Nauk. Seriya Matematicheskaya*, 15(4):361–383.
- [Levick et al., 2014] Levick, J., Pereira, R., and Kribs, D. W. (2014). The four-dimensional Perfect-Mirsky Conjecture. In *Proceedings of the American Mathematical Society*, volume 143, pages 1951–1956.
- [Marcus and Ree, 1959] Marcus, M. and Ree, R. (1959). Diagonals of doubly stochastic matrices. *The Quarterly Journal of Mathematics*, 10(1):296–302.
- [Mashreghi and Rivard, 2007] Mashreghi, J. and Rivard, R. (2007). On a conjecture about the eigenvalues of doubly stochastic matrices. *Linear and Multilinear Algebra*, 55(5):491–498.
- [OEIS, 2019] OEIS (2019). The On-Line Encyclopedia of Integer Sequences. <https://oeis.org/A110143>. [Online; accessed 8-August-2019].
- [Perfect and Mirsky, 1965] Perfect, H. and Mirsky, L. (1965). Spectral properties of doubly-stochastic matrices. *Monatshefte für Mathematik*, 69(1):35–57.
- [Swift, 1972] Swift, J. (1972). The location of characteristic roots of stochastic matrices. Master’s thesis, McGill University.

Appendices

A Supplementary Figures

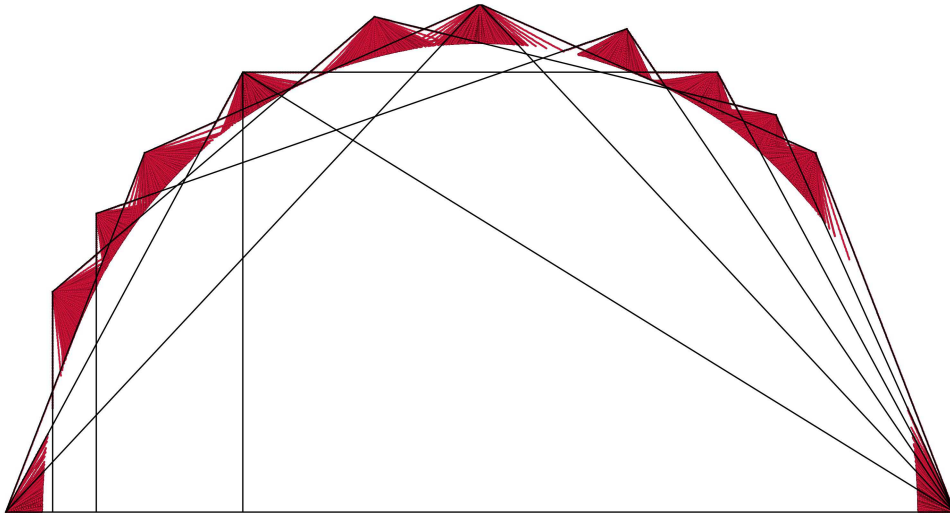


Figure 12: Inequivalent pairs for DS_8 . Inscribed circle omitted.

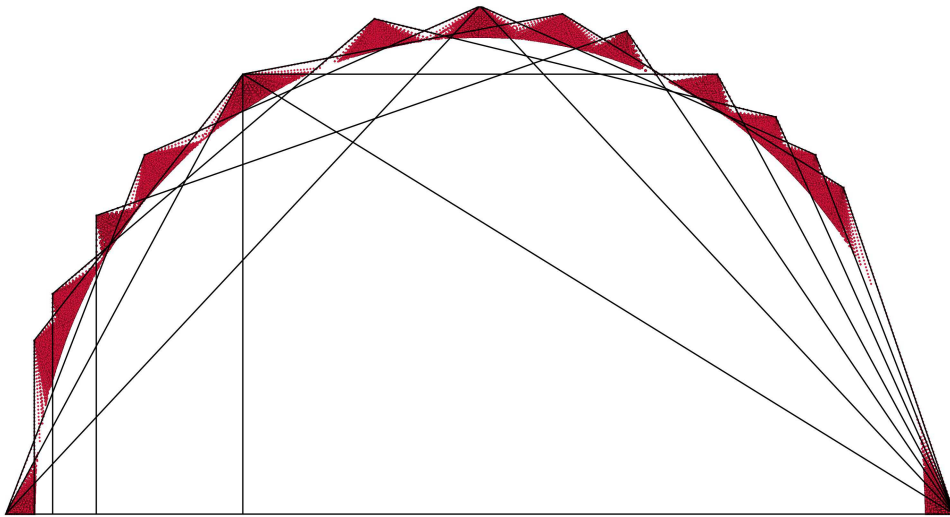


Figure 13: Inequivalent pairs for DS_9 . Inscribed circle omitted.