

Shuffling Cards via One-sided Transpositions

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Joint work with Michael Bate and Oliver Matheau-Raven



Introduction

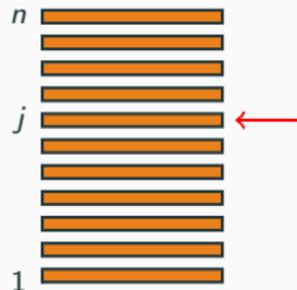
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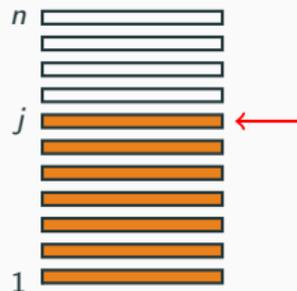
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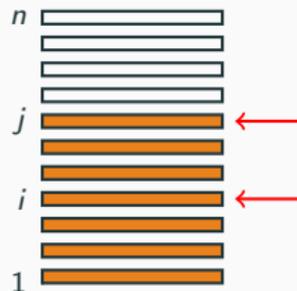
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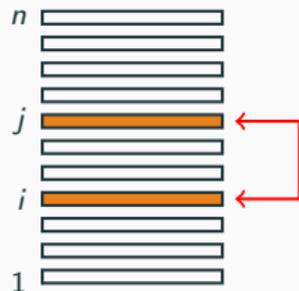
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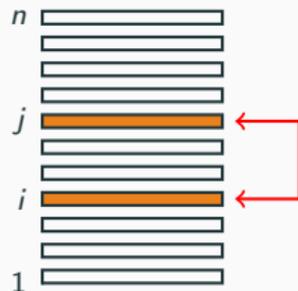
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Natural question

How many shuffles does it take to “randomize” the deck?

(What is this shuffle’s **mixing time**?)



Card shuffles as random walks

Most interesting card shuffles can be viewed as **random walks on the symmetric group**, S_n , with uniform stationary distribution π_n :

- top-to-random
- riffle shuffle
- random-to-random
- random k -cycles
- adjacent transpositions
- semi-random transpositions

Methods of bounding the rate of convergence to equilibrium include:

- coupling
- strong uniform times
- eigenanalysis
- representation theory

Card shuffles as random walks

Measure distance from equilibrium using the **total variation metric**:

$$d_n(t) = \sup_{B \subset S_n} (P_n^t(B) - \pi_n(B)) = \frac{1}{2} \sum_{\sigma \in S_n} |P_n^t(\sigma) - \pi_n(\sigma)|.$$

- takes values in $[0, 1]$
- in general, will depend upon the starting state, but not if (as here) the Markov chain is **transitive**.

Define the ε -**mixing time** to be

$$t_n^{\text{mix}}(\varepsilon) = \min\{t : d_n(t) \leq \varepsilon\}.$$

The cutoff phenomenon

Many shuffles exhibit somewhat surprising convergence behaviour...

Definition

The sequence of shuffles generated by $(P_n)_{n \in \mathbb{N}}$ exhibits a **cutoff** at time t_n with *window* of size w_n if $w_n = o(t_n)$ and:

$$\begin{aligned}\lim_{c \rightarrow \infty} \liminf_{n \rightarrow \infty} d_n(t_n - cw_n) &= 1 \\ \lim_{c \rightarrow \infty} \limsup_{n \rightarrow \infty} d_n(t_n + cw_n) &= 0.\end{aligned}$$

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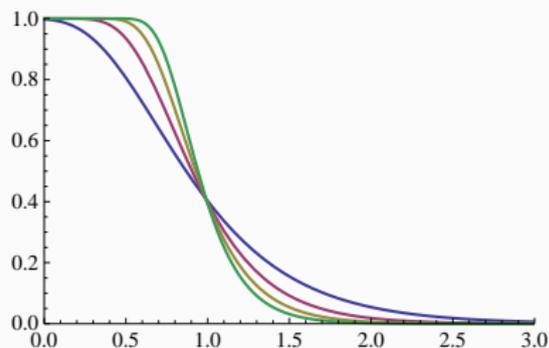
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Cutoff implies that

$$t_n^{\text{mix}}(\varepsilon) \sim t_n \text{ for all } \varepsilon > 0.$$



The cutoff phenomenon

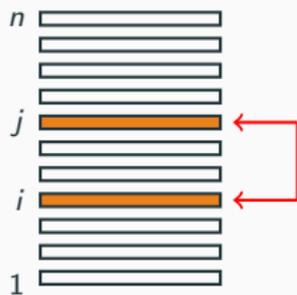
Previous results:

- top-to-random
→ cutoff at $n \log n$
- riffle shuffle
→ cutoff at $\frac{3}{2} \log_2 n$
- random-to-random
→ cutoff at $\frac{3}{4} n \log n$
- random k -cycles
→ cutoff at $\frac{n}{k} \log n$
- adjacent transpositions
→ cutoff at $\frac{n^2}{2\pi^2} \log n$
- semi-random transpositions
→ upper bound $O(n \log n)$

The one-sided transposition shuffle

Our shuffle transposes cards in positions (i, j) with probability

$$P_n(i, j) = \frac{1}{jn}, \text{ for all } 1 \leq i \leq j \leq n.$$



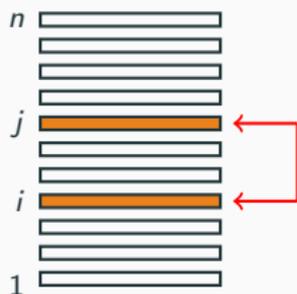
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This differs significantly from previously studied shuffles which have been analysed using group representation theory:

- **dependence** between Left and Right hands
- generating set is entire conjugacy class of transpositions, but P_n is **far from uniform** on this set



Our main results

Theorem

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By **biasing** the Right hand, we can recover this result as a special case of the following:

Theorem

Suppose that the Right hand chooses card j with probability proportional to j^α . Then we see a cutoff at time t_n :

α	$(-\infty, -1)$	-1	$(-1, 1]$	$(1, \infty)$
t_n	$\zeta(-\alpha)n^{-\alpha} \log n$	$n(\log n)^2$	$\frac{1}{1+\alpha} n \log n$	$\frac{\alpha}{1+\alpha} n \log n$

Upper bound

We use the classical ℓ^2 bound on total variation distance.

Lemma

Let the eigenvalues of P_n be $1 = \beta_1 > \beta_2 \geq \dots \geq \beta_m > -1$. Then

$$d_n(t)^2 \leq \frac{1}{4} \sum_{i \neq 1} \beta_i^{2t}.$$

Our analysis is inspired by work of [Dieker & Saliola \(2018\)](#) and [Bernstein & Nestoridi \(2019\)](#) on the random-to-random shuffle.

To get a handle on the eigenvalues of P_n we need to introduce the concept of **Young tableaux**.

Young tableaux

Definition

A **partition** of n is a decreasing tuple $\lambda = (\lambda_1, \lambda_2, \dots, \lambda_l)$ such that $\sum_i \lambda_i = n$ and $\lambda_1 \geq \dots \geq \lambda_l$. We denote this by $\lambda \vdash n$.

We may represent a partition using a **Young diagram**, e.g.

$$(3, 2) = \begin{array}{|c|c|c|} \hline \square & \square & \square \\ \hline \square & \square & \\ \hline \end{array} \quad (2, 2, 1) = \begin{array}{|c|c|} \hline \square & \square \\ \hline \square & \square \\ \hline \square & \\ \hline \end{array} \quad (5) = \begin{array}{|c|c|c|c|c|} \hline \square & \square & \square & \square & \square \\ \hline \end{array}$$

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A **standard Young tableau** (SYT) is an allocation of $1, \dots, n$ to a Young diagram, such that rows and columns are increasing, e.g.

$$\begin{array}{|c|c|c|} \hline 1 & 2 & 3 \\ \hline 4 & 5 & \\ \hline \end{array} \quad \begin{array}{|c|c|c|} \hline 1 & 2 & 4 \\ \hline 3 & 5 & \\ \hline \end{array} \quad \begin{array}{|c|c|c|} \hline 1 & 2 & 5 \\ \hline 3 & 4 & \\ \hline \end{array} \quad \begin{array}{|c|c|c|} \hline 1 & 3 & 4 \\ \hline 2 & 5 & \\ \hline \end{array} \quad \begin{array}{|c|c|c|} \hline 1 & 3 & 5 \\ \hline 2 & 4 & \\ \hline \end{array}$$

The **dimension** of λ , d_λ , is the number of tableaux of shape λ .

Link to eigenvalues

Theorem

The eigenvalues of P_n are labelled by standard Young tableaux of size n , and the eigenvalue represented by a tableau of shape λ appears d_λ times.

Lemma

The eigenvalue corresponding to a tableau T is given by

$$\text{eig}(T) = \frac{1}{n} \sum_{\substack{\text{boxes} \\ (i,j) \in T}} \frac{j-i+1}{T(i,j)}.$$

Example: if $T = \begin{array}{|c|c|c|} \hline 1 & 2 & 3 \\ \hline 4 & 5 & \\ \hline \end{array}$ then $\text{eig}(T) = \frac{1}{5} \left(\frac{1}{1} + \frac{2}{2} + \frac{3}{3} + \frac{0}{4} + \frac{1}{5} \right)$.

Main ideas:

1. Natural recursive structure:

- a deck of $(n + 1)$ cards contains a deck labelled $1, \dots, n$;
- this corresponds to a natural embedding of S_n inside S_{n+1} ;
- we can obtain Young diagrams for partitions of $(n + 1)$ by adding boxes to diagrams representing partitions of n .

2. Commutation relation between the operator on n cards and the operator on $(n + 1)$ cards:

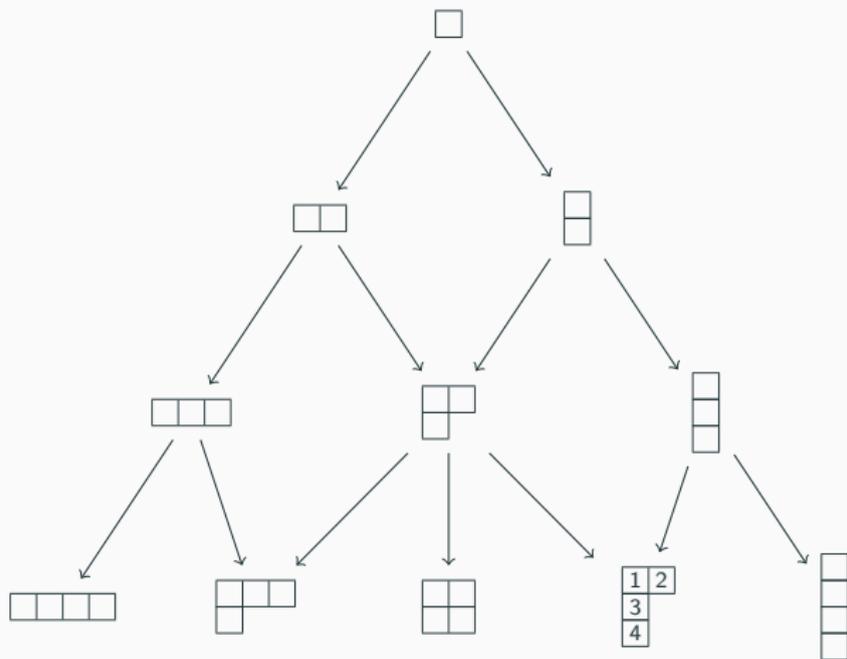
- arises when we consider the difference between

adding a card and shuffling

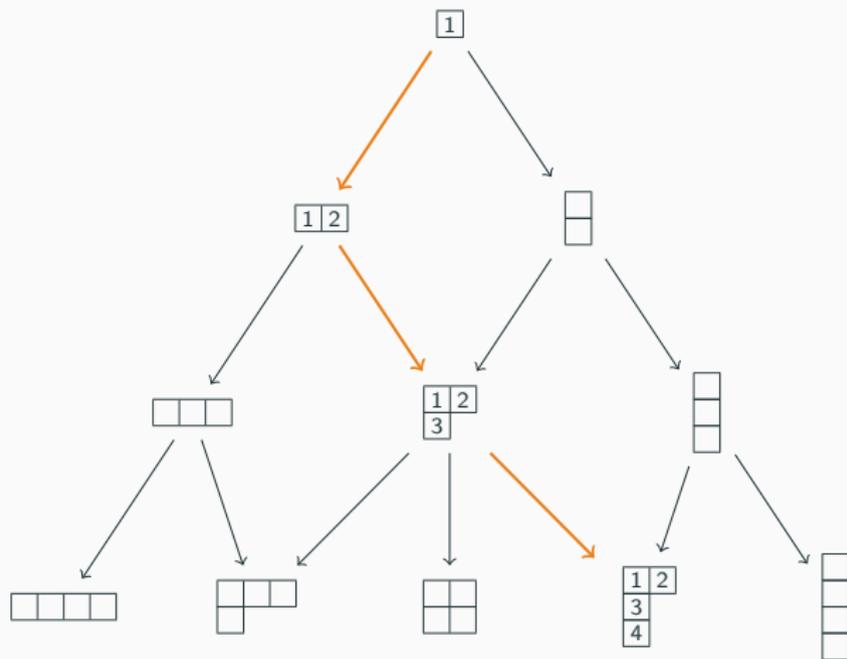
versus

shuffling and then adding a card.

Upshot: we may **lift** the eigenvalues of P_n to obtain those of P_{n+1} by following paths through **Young's lattice**.



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Upper bound on the mixing time

Combining these results we obtain the bound:

$$d_n(t)^2 \leq \frac{1}{4} \sum_{i \neq 1} \beta_i^{2t} = \frac{1}{4} \sum_{\substack{\lambda \vdash n \\ \lambda \neq (n)}} d_\lambda \sum_{T \in \text{SYT}(\lambda)} \text{eig}(T)^{2t}$$

To establish how large t must be to make this small, we need to understand how the **dimensions** and **eigenvalues** behave for large n .

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Theorem

For any $c > 0$,

$$\limsup_{n \rightarrow \infty} d_n(n \log n + cn) \leq \sqrt{2}e^{-c}.$$

Two helpful types of monotonicity.

1. Fixed λ , different tableaux.

Construct T_λ^\downarrow by filling boxes of λ from top to bottom, and T_λ^\rightarrow by filling boxes from left to right.

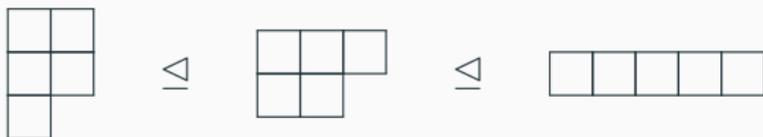
For any $T \in \text{SYT}(\lambda)$,

$$\text{eig}(T_\lambda^\downarrow) \leq \text{eig}(T) \leq \text{eig}(T_\lambda^\rightarrow)$$

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$\text{eig}(T)$	0.503	0.523	0.57	0.59	0.64																														

2. Dominance ordering of partitions.

Write $\mu \trianglelefteq \lambda$ if we can form λ by moving boxes of μ up and right.



If $\mu \trianglelefteq \lambda$ then

$$\text{eig}(T_{\mu}^{\rightarrow}) \leq \text{eig}(T_{\lambda}^{\rightarrow}) \quad \text{and} \quad \text{eig}(T_{\mu}^{\downarrow}) \leq \text{eig}(T_{\lambda}^{\downarrow})$$

So it makes sense to deal with **large** ($\lambda_1 \geq 3n/4$) and **small** partitions separately, exploiting the above.

Upper bound insight: consider the partition $\lambda = (n - 1, 1)$. There are $(n - 1)$ tableaux with this shape ($d_\lambda = n - 1$), with the largest eigenvalue coming from the tableau T_λ^{\rightarrow} :

1	2	3	...	$n - 2$	$n - 1$
n					

The corresponding eigenvalue is $1 - \frac{1}{n}$, and so this partition makes a contribution to the upper bound of at most

$$d_\lambda \sum_{T \in \text{SYT}(\lambda)} \text{eig}(T)^{2t} \leq (n - 1)^2 \left(1 - \frac{1}{n}\right)^{2t},$$

which at time $t = n \log n + cn$ is no greater than e^{-2c} .

Lower bound

Theorem

For any $c > 2$,

$$\liminf_{n \rightarrow \infty} d_n(n \log n - n \log \log n - cn) \geq 1 - \frac{\pi^2}{6(c-2)^2}.$$

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Sketch proof

For any set of permutations $B_n \subset S_n$,

$$d_n(t) \geq P_n^t(B_n) - \pi_n(B_n).$$

Focus on cards near the top of the deck, since intuitively these should take longer to mix.

Let

$$B_n = \{\rho \in S_n : \rho \text{ has } \geq 1 \text{ fixed point in top } n/\log n \text{ cards}\}.$$

Then

- $\pi_n(B_n) \leq 1/\log n$
- $P_n^t(B_n) \geq \mathbb{P}(\text{not all top } n/\log n \text{ cards touched by time } t)$

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Now estimate how many shuffles it takes for all top $n/\log n$ cards to be touched, by **coupling** with a counting process.

This is similar to the standard coupon-collector problem, **but**:

- the Right and Left hands don't "collect" cards independently
- the counting process can increment by either one or two.



Final remarks

- Our analysis yields an **exact formula** for all of the eigenvalues of the one-sided transposition shuffle;
- The results give the **cutoff time** and a bound on the **cutoff window**;
- **Weighting** the distribution of the Right hand shows that mixing is fastest when Right and Left hands are independent.

Going further

- Same ideas used by others to tackle different transposition shuffles (one-sided k -transpositions; generalized symmetric groups; Jucys–Murphy elements);
- More general one-sided shuffles?
- Is there a distributional approximation for the shuffle near cutoff?

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