

# Real Applications of Structural Combinatorics

## Three Case Studies

Cheyne Homberger



CCICADA

March 13th, 2014

Patterns in Data

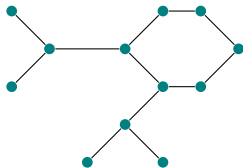
Genome Rearrangement

Combinatorial Testing

## Relational Structures

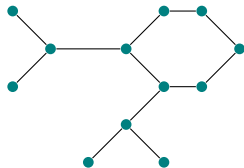
# Combinatorial Structures

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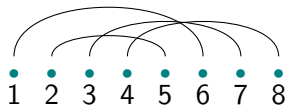


Graphs

# Combinatorial Structures

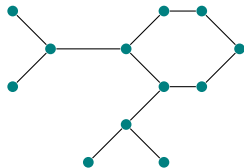


Graphs

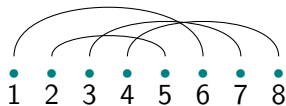


Matchings

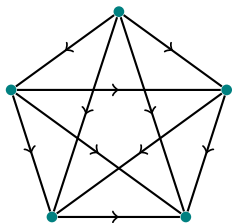
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Graphs

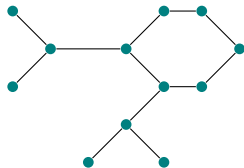


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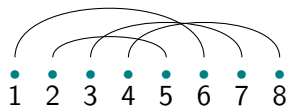


Tournaments

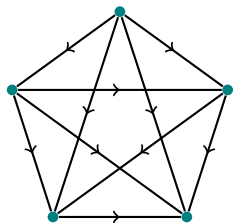
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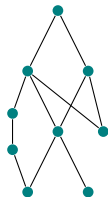
Graphs



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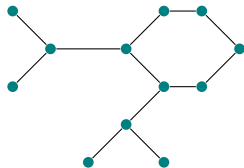
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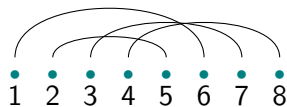
Posets



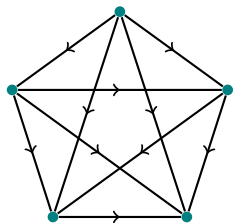
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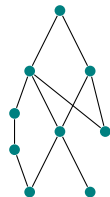
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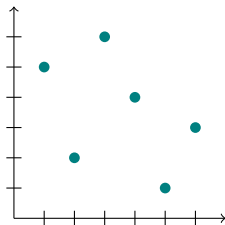
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Permutations

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## Example

A graph is a ground set (vertices) together with a 2-relation (edges) which is symmetric and nonreflexive.

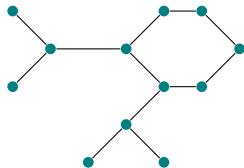
That is:

$$\mathcal{G} = (\mathcal{S}, \mathcal{R}), \text{ where } \mathcal{R} \subset \mathcal{S} \times \mathcal{S},$$

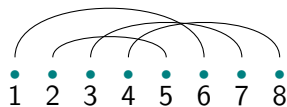
with

$$(x, y) \in \mathcal{R} \implies (y, x) \in \mathcal{R}, \text{ and } (x, x) \notin \mathcal{R} \forall x \in \mathcal{S}.$$

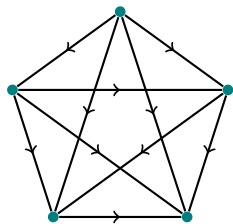
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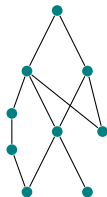
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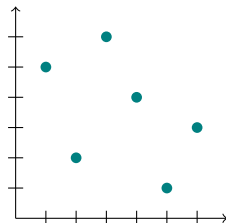
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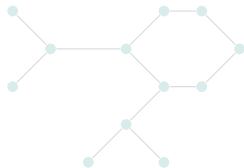


Posets



Permutations

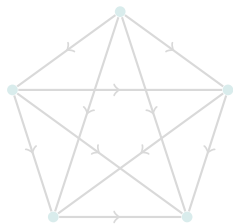
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Graphs



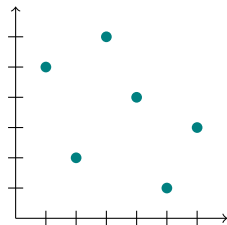
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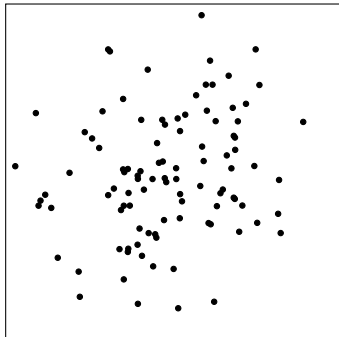
Posets



Permutations

# Patterns in Data (and Permutations)

## Random Data



# Permutations



# Permutations

## Definition

An *permutation of length  $n$*  is a bijection from the set  $[n] = \{1, 2, \dots, n\}$  to itself. The *one-line notation* for a permutation  $\pi$  is

$$\pi = \pi(1)\pi(2) \dots \pi(n).$$

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- ▶ The six permutations of length 3 are

$$\mathfrak{S}_3 = \{123, 132, 213, 231, 312, 321\}.$$

# Plotting Permutations

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If  $\pi$  is a permutation of length  $n$ , then the *plot* of  $\pi$  is the set of points

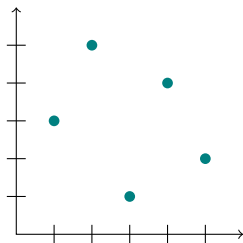
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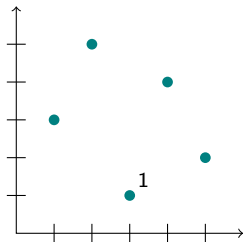
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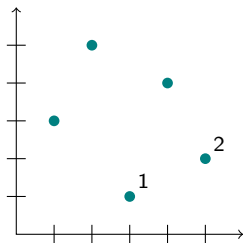
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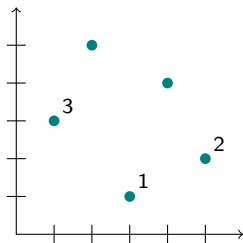
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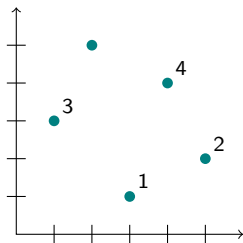


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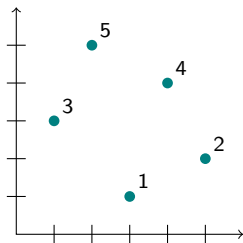
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Let  $A$  and  $B$  be two sets of  $n$  points in  $\mathbb{R}^2$ , each with the property that no two points lie on the same horizontal or vertical line.

Say that  $A$  is *order isomorphic* to  $B$  (denoted  $A \sim B$ ) if  $A$  can be transformed into  $B$  by stretching, contracting, and translating the axes horizontally and vertically.

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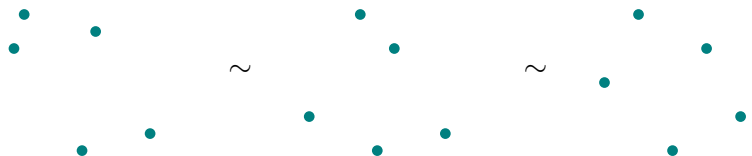
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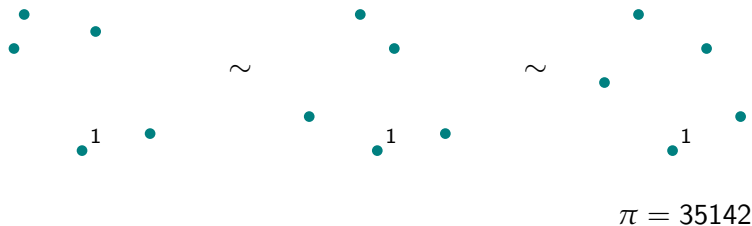
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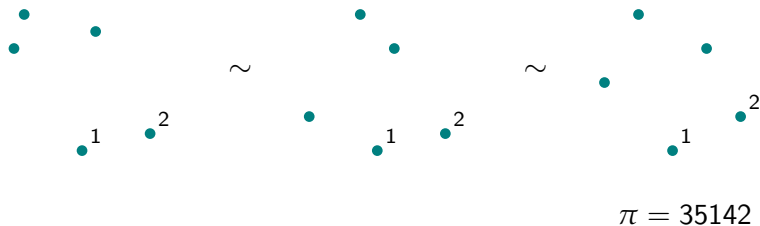
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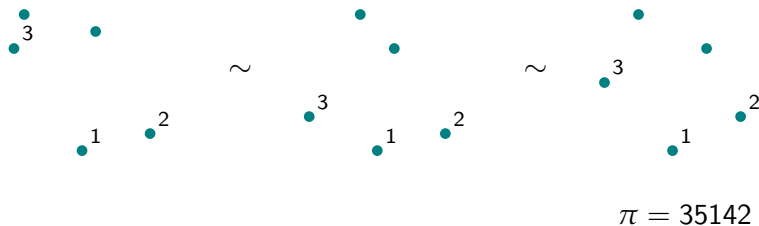
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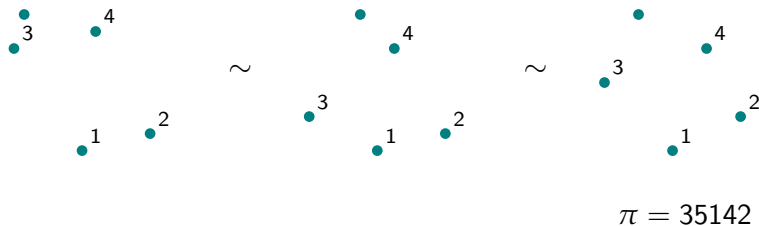
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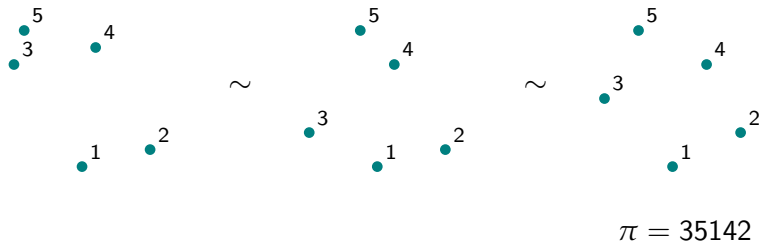
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# Permutation Symmetries

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For a permutation  $\pi = \pi_1 \pi_2 \dots \pi_n$ , the reverse, the complement, and the inverse of  $\pi$  are denoted  $\pi^r$ ,  $\pi^c$ , and  $\pi^{-1}$ , and defined as follows:

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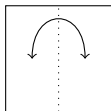
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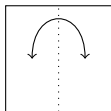
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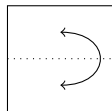
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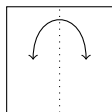
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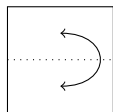
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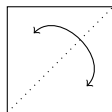
$\pi$



$\pi^r$

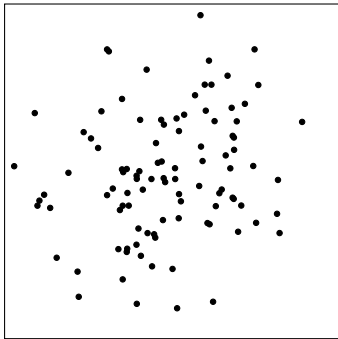


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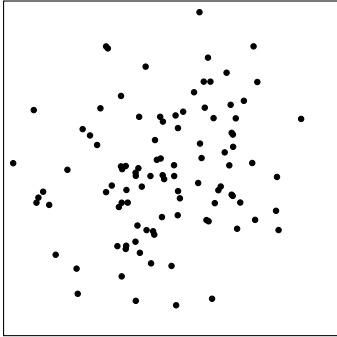


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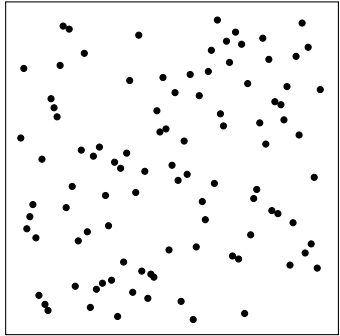
## Random Data



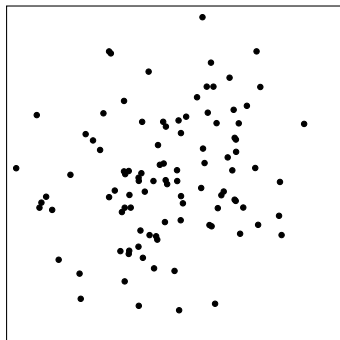
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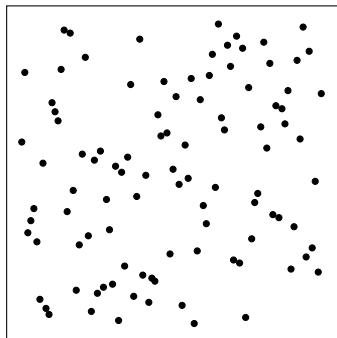
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$\pi =$  61 84 31 35 39 28 9 54 6 4 74 71 68 85 98 38 97 45 12 27 57 89 30 5 55 11 58  
13 42 32 14 53 2 51 20 56 80 10 43 95 17 50 8 16 15 70 63 81 64 24 52 76 47  
7 60 49 82 1 25 75 40 34 83 90 46 100 69 65 93 86 22 96 21 92 3 79 29 41  
44 66 94 59 87 37 73 36 72 67 78 19 33 88 62 99 23 91 26 48 18 77

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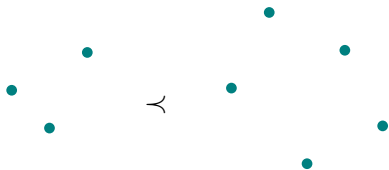
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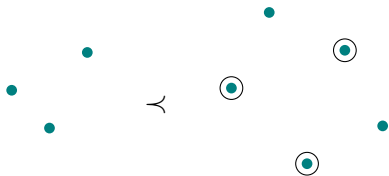
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# Permutation Patterns

## Definition

Let  $\pi = \pi(1)\pi(2)\cdots\pi(n)$  and  $\sigma = \sigma(1)\sigma(2)\cdots\sigma(k)$  be two permutations.  $\pi$  contains  $\sigma$  as a pattern (written  $\sigma \prec \pi$ ) if there is some subsequence  $\pi(i_1)\pi(i_2)\cdots\pi(i_k)$  which is order isomorphic to the entries of  $\sigma$  (i.e.,  $\pi(i_j) < \pi(i_k)$  if and only if  $\sigma(j) < \sigma(k)$ ).



213

$\prec$

**35142**



# Permutation Patterns

## Example

The pattern 12 is contained in all permutations *except* for the decreasing ones:

$$12 \not\prec n \dots 321.$$

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## Definition

If a permutation  $\pi$  does not contain a pattern  $\sigma$ , we say that  $\pi$  *avoids*  $\sigma$ . The set of all permutations which avoid a given pattern (or set of patterns)  $\sigma$  is denoted

$$\text{Av}(\sigma).$$

# Permutation Classes

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## Definition

A *permutation class* is a set  $\mathcal{C}$  of permutations for which, if  $\pi \in \mathcal{C}$  and  $\sigma \prec \pi$ , then  $\sigma \in \mathcal{C}$ . Let  $\mathcal{C}_n$  denote the set of permutations of length  $n$  in  $\mathcal{C}$ .

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## Example

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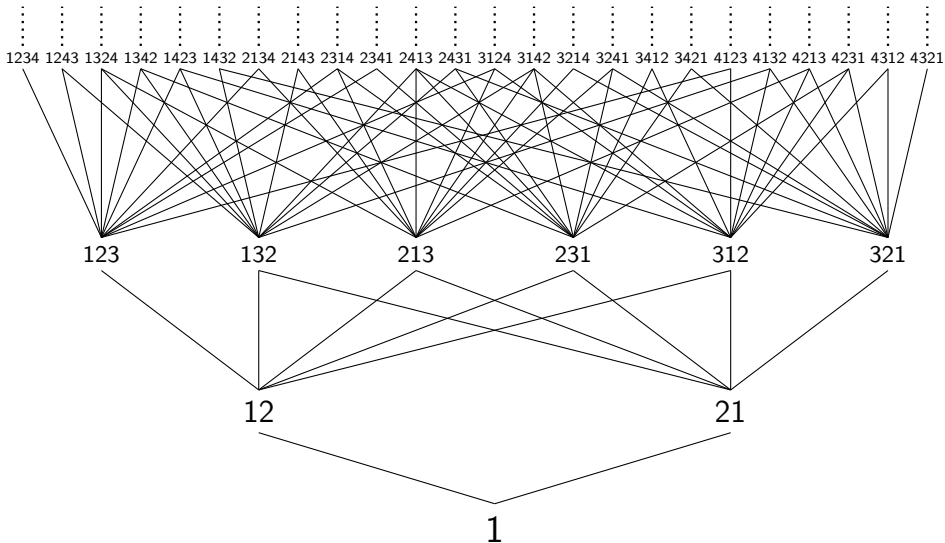
## Theorem (Marcus and Tardos, 2004)

Every proper permutation class has a finite exponential growth rate. That is, for any proper class  $\mathcal{C}$ , there exists a real number  $s$  such that

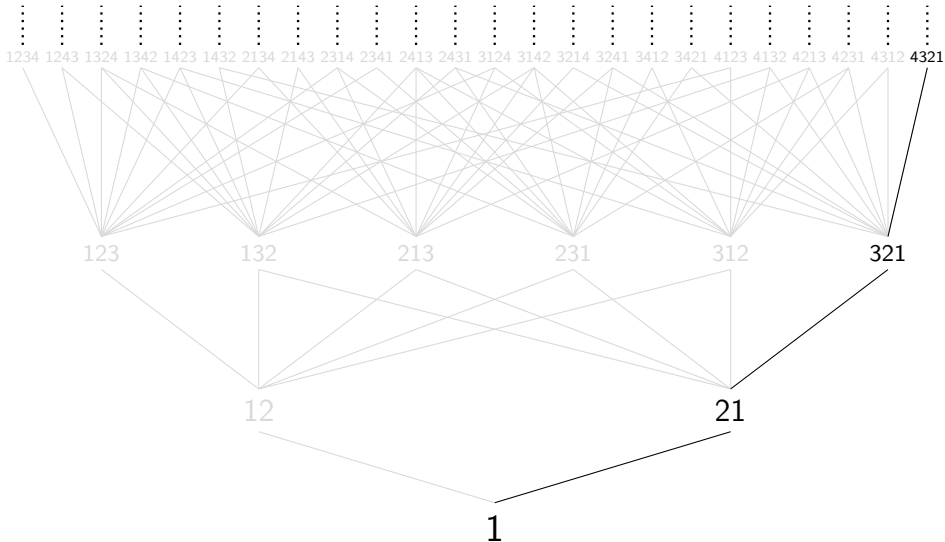
$$\limsup_{n \rightarrow \infty} \sqrt[n]{|\mathcal{C}_n|} = s.$$

This number  $s$  is the *growth rate* of the class.

# Permutation Classes - Growth Rates

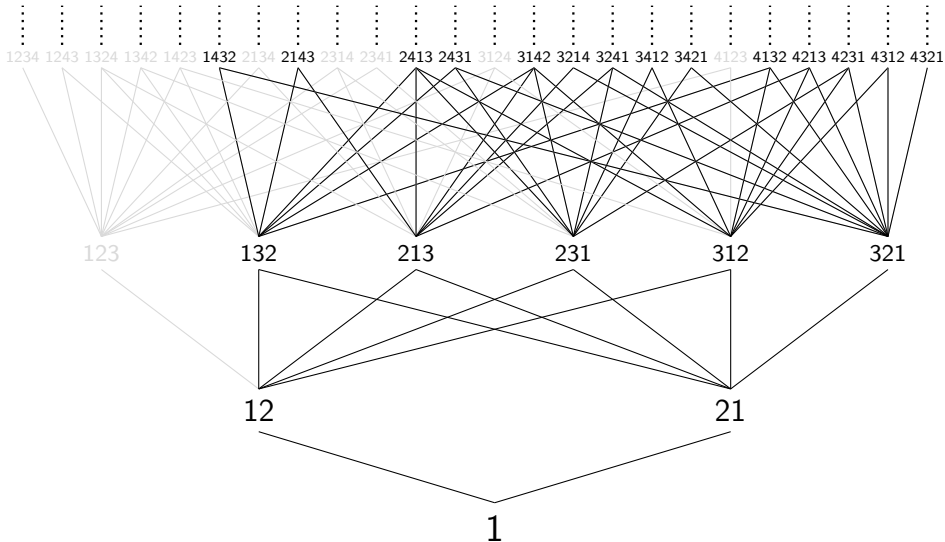


# Permutation Classes - Growth Rates

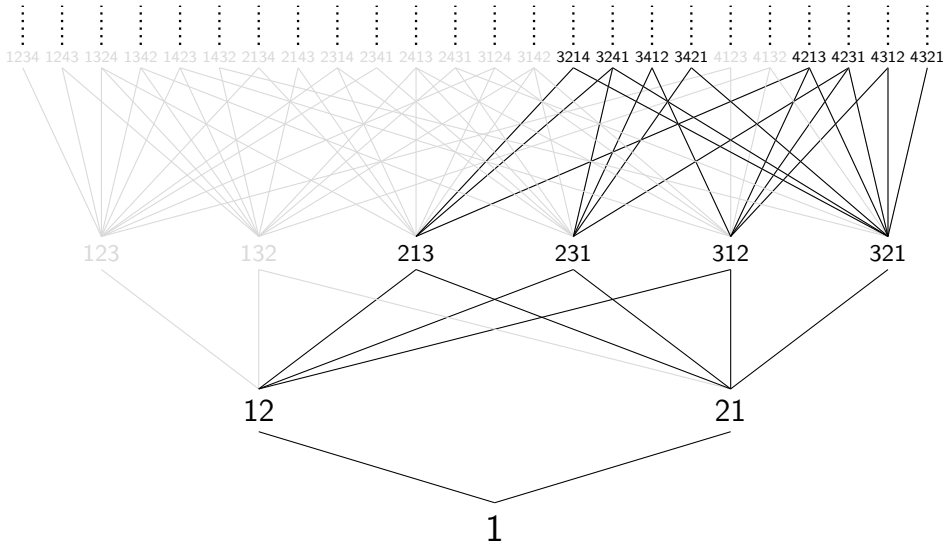




# Permutation Classes - Growth Rates



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## The Class $\text{Av}(132)$

### Definition

Let  $c_n$  be the number of permutations of length  $n$  which *avoid* the pattern 132, and  $C(x) = \sum_{n \geq 0} c_n x^n$ .

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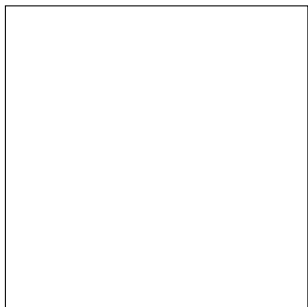
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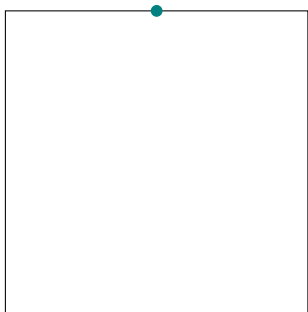
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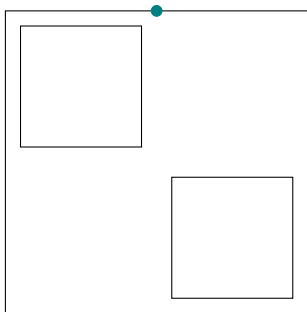
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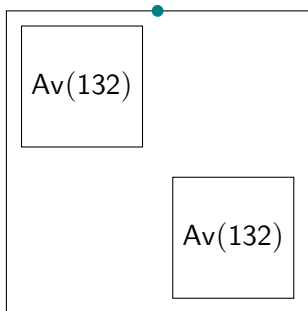
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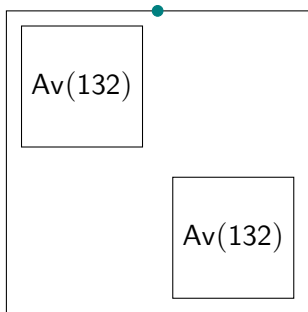
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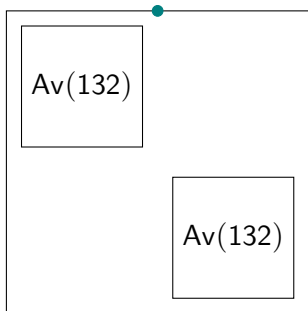
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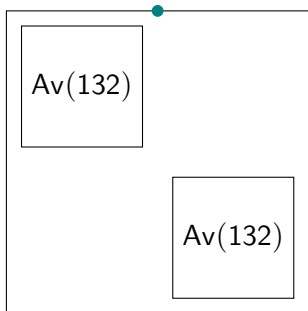
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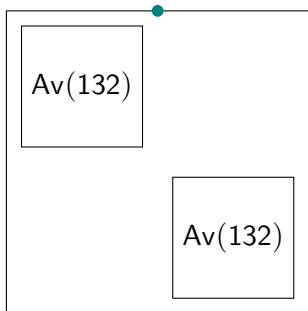
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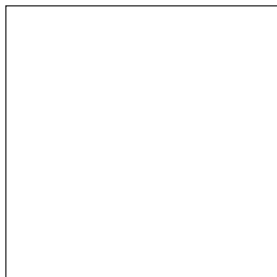
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The Class Av(123)

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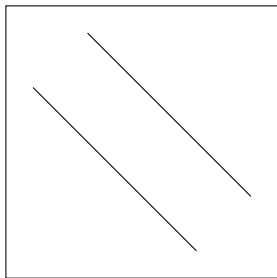
What does a 123-avoiding permutation look like?



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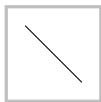
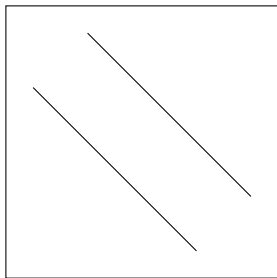
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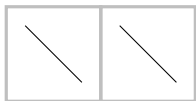
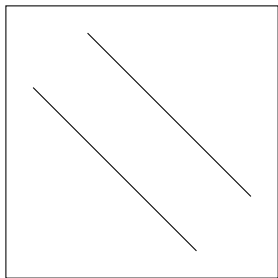




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## Question

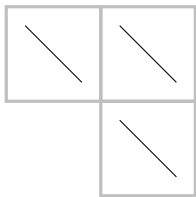
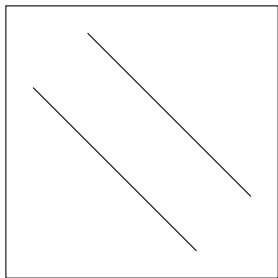
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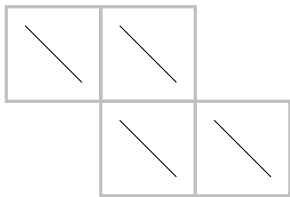
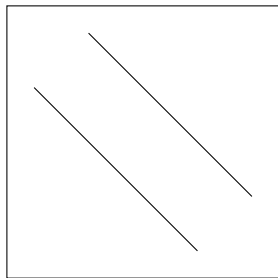
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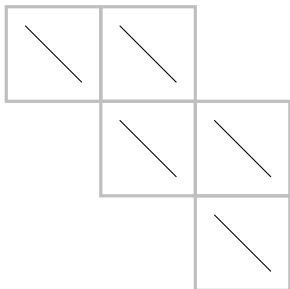
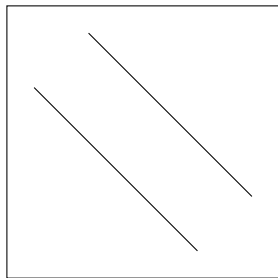
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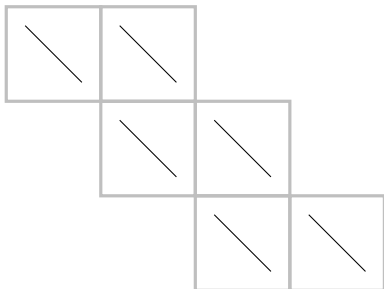
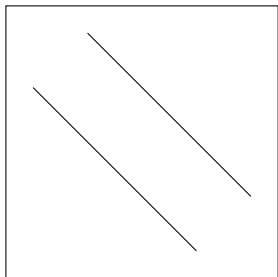
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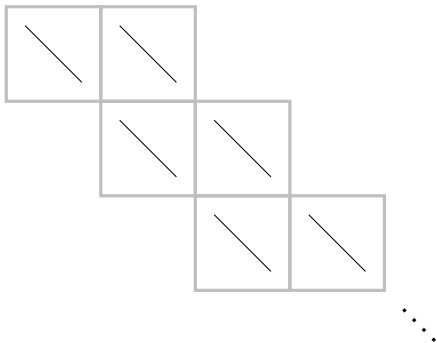
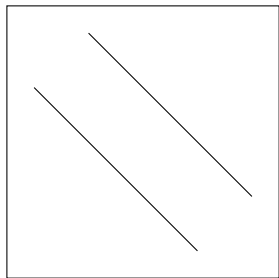
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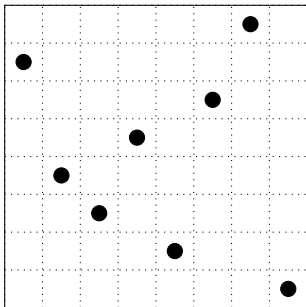
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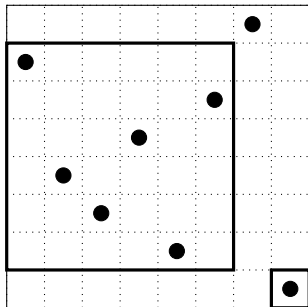


$Av(132)$  and  $Av(123)$



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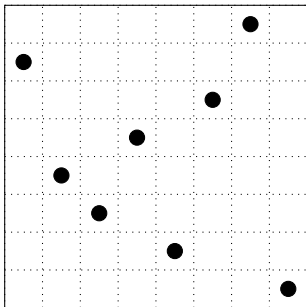
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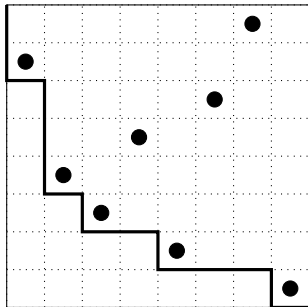


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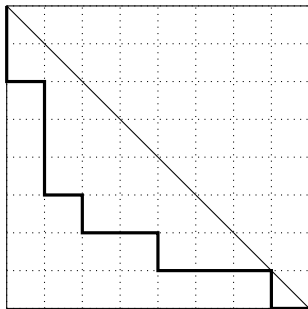
$Av(132)$

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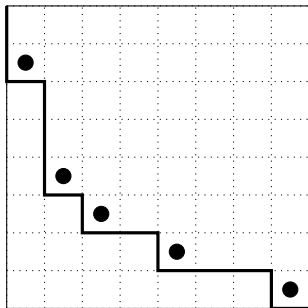
$Av(132)$

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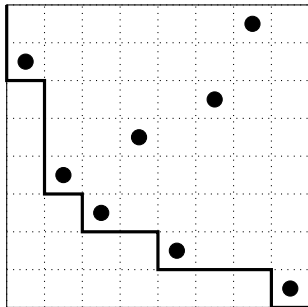
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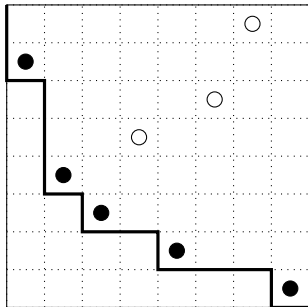
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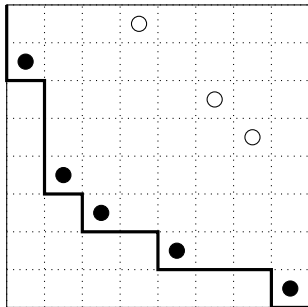
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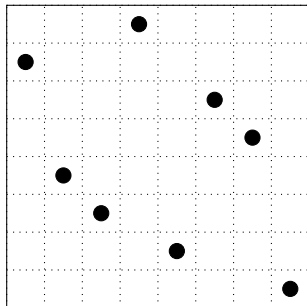
$Av(132)$

$Av(132)$  and  $Av(123)$



$Av(132) \mapsto Av(123)$

$Av(132)$  and  $Av(123)$



$Av(123)$



$Av(132)$  and  $Av(123)$

$$|Av_n(123)| = |Av_n(132)|$$

## $Av(132)$ and $Av(123)$

$$|Av_n(123)| = |Av_n(132)| = \frac{1}{n+1} \binom{2n}{n}.$$

# Pattern Occurrences

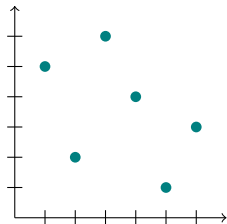
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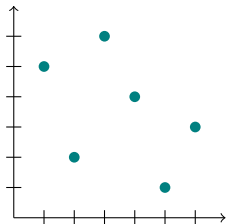


132  $\prec$  526413

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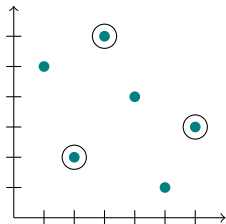
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$$\nu_{132}(526413) = 3$$

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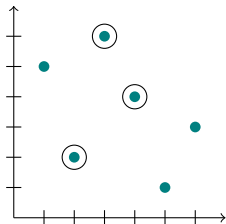
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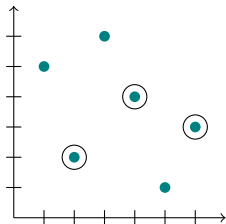
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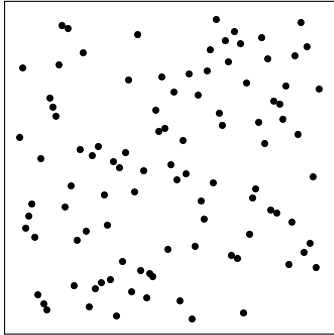


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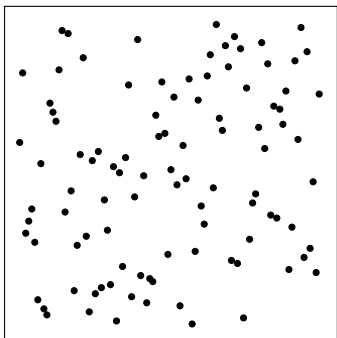
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# Random Data

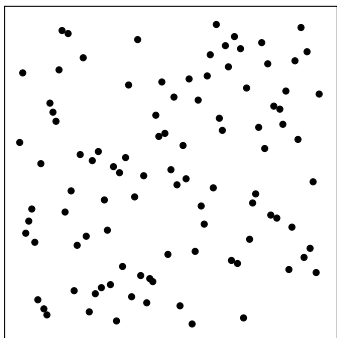


## Random Data



$v_{12}$	$v_{21}$	Avg
2803	2147	2475

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$v_{123}$	$v_{132}$	$v_{213}$	$v_{231}$	$v_{312}$	$v_{321}$	Avg
35357	30063	31414	22321	23348	19197	26950

## Patterns as Random Variables

### Theorem (Bóna 2007)

For a (uniformly) randomly selected permutation of length  $n$ , the random variables  $\nu_\sigma$  are asymptotically normal as  $n$  approaches infinity.

### Theorem (Janson, Nakamura, Zeilberger 2013)

For a randomly selected permutation of length  $n$  and two patterns  $\sigma$  and  $\rho$ , the random variables  $\nu_\sigma$  and  $\nu_\rho$  are asymptotically jointly normally distributed as  $n \rightarrow \infty$ .

## Motivation

### Fact

In  $\mathfrak{S}_n$ , the number of occurrences of a specific pattern depends only on the length of the pattern. That is, for a pattern  $\sigma \in \mathfrak{S}_k$ , we have

$$\nu_\sigma(\mathfrak{S}_n) = \frac{n!}{k!} \binom{n}{k}.$$

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### Question

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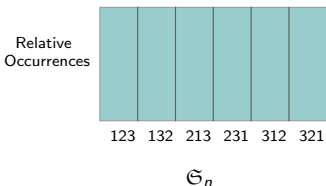
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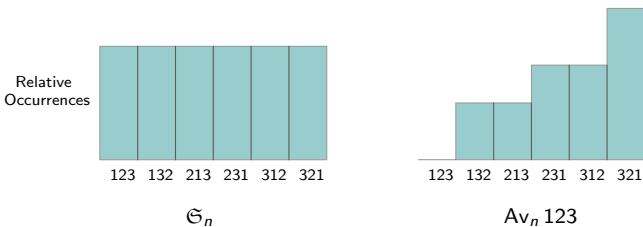
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## Previous Results

### Theorem (Bóna)

In  $Av_n 132$ , the pattern 123 is the least common, 321 is the most common, and  $\nu_{213} = \nu_{231} = \nu_{312}$ .

# Data

## Data

Av 132

length	123	132	213	231	312	321
3	1	0	1	1	1	1
4	10	0	11	11	11	13
5	68	0	81	81	81	109
6	392	0	500	500	500	748
7	2063	0	2794	2794	2794	4570

## Data

### Av 132

length	123	132	213	231	312	321
3	1	0	1	1	1	1
4	10	0	11	11	11	13
5	68	0	81	81	81	109
6	392	0	500	500	500	748
7	2063	0	2794	2794	2794	4570

### Av 123

length	123	132	213	231	312	321
3	0	1	1	1	1	1

## Data

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length	123	132	213	231	312	321
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### Av 123

length	123	132	213	231	312	321
3	0	1	1	1	1	1
4	0	9	9	11	11	16

## Data

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length	123	132	213	231	312	321
3	1	0	1	1	1	1
4	10	0	11	11	11	13
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### Av 123

length	123	132	213	231	312	321
3	0	1	1	1	1	1
4	0	9	9	11	11	16
5	0	57	57	81	81	144
6	0	312	312	500	500	1016
7	0	1578	1578	2794	2794	6271

## Patterns Within $Av(123)$

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### Theorem

The total number of 231 (and 312) patterns is identical within the sets  $Av_n(123)$  and  $Av_n(132)$ .



## Patterns Within $\text{Av}(123)$

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The total number of 231 (and 312) patterns is identical within the sets  $\text{Av}_n(123)$  and  $\text{Av}_n(132)$ .

Further, within  $\text{Av}_n(123)$ ,

$$v_{132} = v_{213} \sim \sqrt{\frac{n}{\pi}} 4^n,$$

$$v_{231} = v_{312} \sim \frac{n}{2} 4^n,$$

$$\text{and } v_{321} \sim \frac{8}{3} \sqrt{\frac{n^3}{\pi}} 4^n.$$

## Sketch of Proof: Patterns in $Av(123)$

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$\nu_{132}$     $\nu_{213}$     $\nu_{231}$     $\nu_{312}$     $\nu_{321}$

## Sketch of Proof: Patterns in Av(123)

$$v_{132} + v_{213} + v_{231} + v_{312} + v_{321} = \binom{n}{3} c_n$$

(Both sides count the number of length three patterns)

## Sketch of Proof: Patterns in $\text{Av}(123)$

$$2\nu_{132} + 2\nu_{213} + \nu_{231} + \nu_{312} = (n - 2)\nu_{12}$$

(Count triples containing a 12 pattern ...)

## Sketch of Proof: Patterns in $\text{Av}(123)$

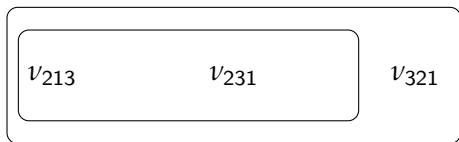
$v_{132}$     $v_{213}$     $v_{231}$     $v_{312}$     $v_{321}$

## Sketch of Proof: Patterns in $\text{Av}(123)$

$$v_{132} = v_{213} \quad v_{231} = v_{312} \quad v_{321}$$

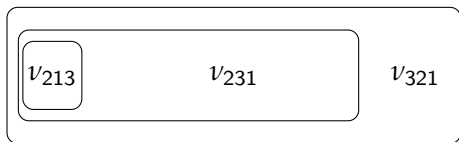
(Since  $\text{Av}(123)$  is closed under inversion)

## Sketch of Proof: Patterns in $\text{Av}(123)$





## Sketch of Proof: Patterns in $\text{Av}(123)$

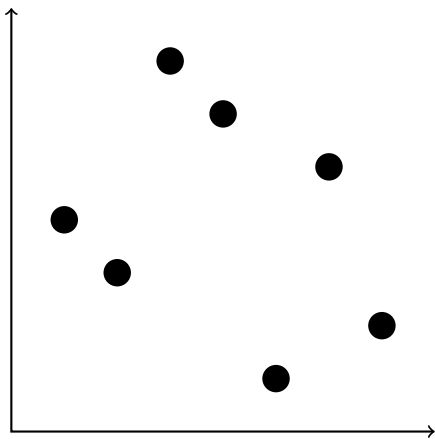


## Sketch of Proof: Counting 213 Patterns

Let  $p = 4\ 3\ 7\ 6\ 1\ 5\ 2$ , and count 213 patterns.

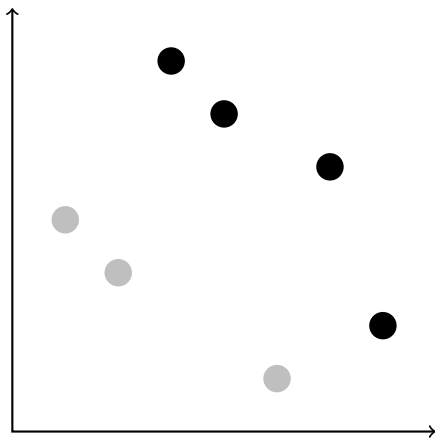
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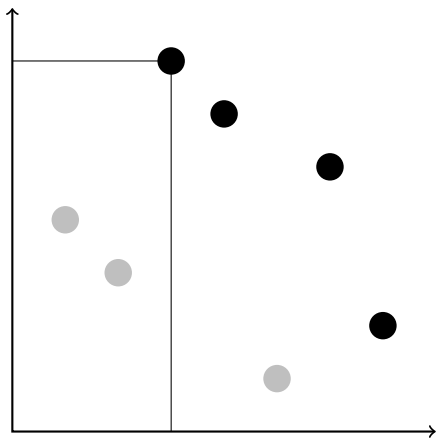
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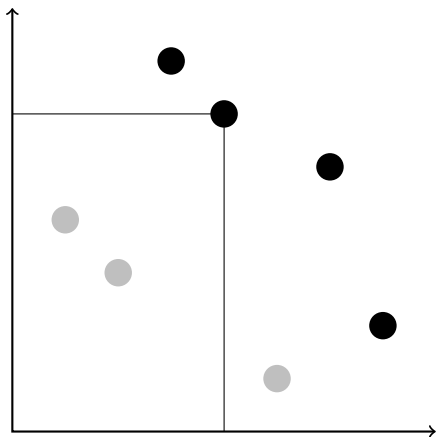
Let  $p = 4\ 3\ 7\ 6\ 1\ 5\ 2$ , and count 213 patterns.



$$v_{213}(p) = \binom{2}{2}$$

## Sketch of Proof: Counting 213 Patterns

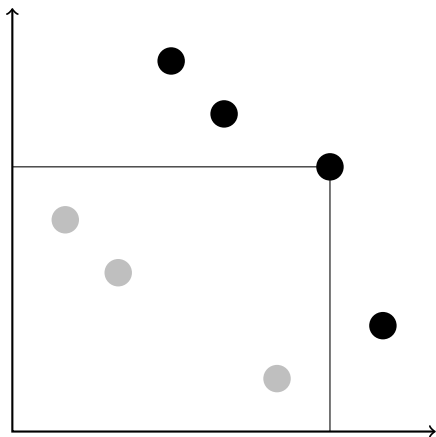
Let  $p = 4\ 3\ 7\ 6\ 1\ 5\ 2$ , and count 213 patterns.



$$v_{213}(p) = \binom{2}{2} + \binom{2}{2}$$

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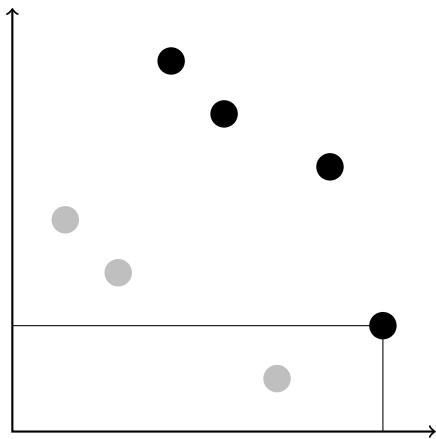
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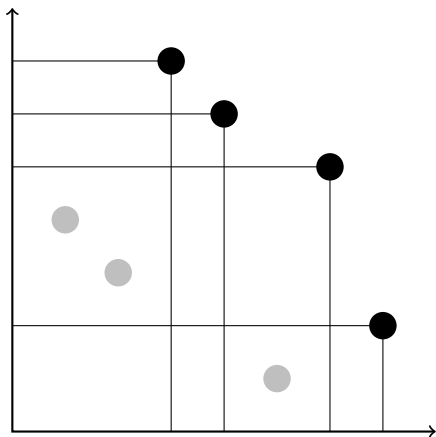


$$v_{213}(p) = \binom{2}{2} + \binom{2}{2} + \binom{3}{2} + \binom{1}{2}$$



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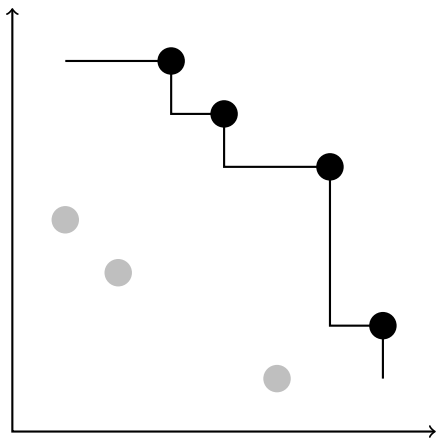
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$$v_{213}(p) = \binom{2}{2} + \binom{2}{2} + \binom{3}{2} + \binom{1}{2} = 5$$

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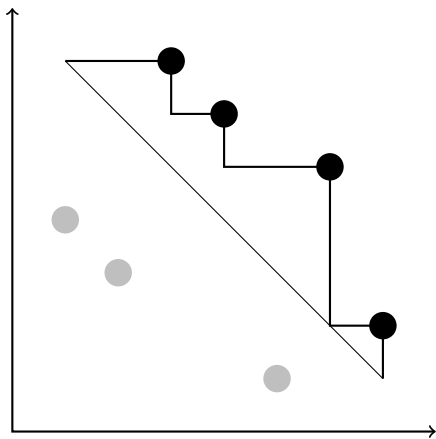
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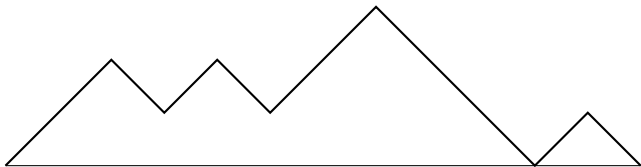
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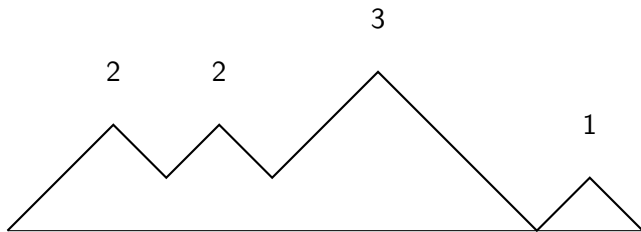
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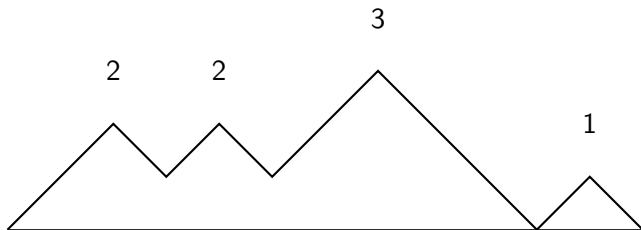
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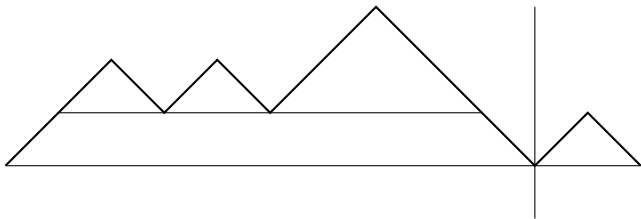
Let  $h_{n,k}$  denote the total number of peaks at height  $k$  in all Dyck paths of semilength  $n$ . Let  $H(x, u) = \sum_{n,k \geq 0} h_{n,k} x^n u^k$ .



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## Sketch of Proof: Counting 213 Patterns

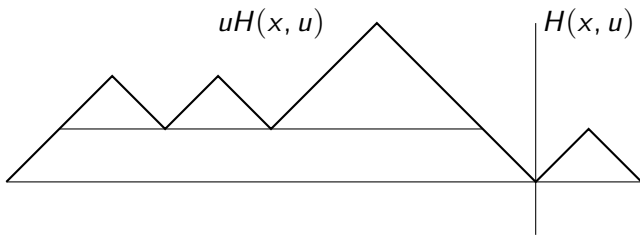
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$$H(x, u) =$$

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$$H(x, u) = ux(H(x, u) + 1)C(x) + xC(x)H(x, u)$$



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$$\sum_{n \geq 0} v_{213}(Av_n^*(123))x^n = \sum_{n \geq 0} \binom{k}{2} h_{n-1,k} x^n$$

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$$= x^3 + 7x^4 + 38x^5 + 187x^6 + \dots$$

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# Results

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$$\nu_{231}(\text{Av}_n 123) = \nu_{231}(\text{Av}_n 132)$$



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$$v_{213} = \frac{n+2}{4} \binom{2n}{n} - 3 \cdot 2^{2n-3}$$

$$v_{231} = (2n-1) \binom{2n-3}{n-2} - (2n+1) \binom{2n-1}{n-1} + (n+4) \cdot 2^{2n-3}$$

$$\begin{aligned} v_{321} &= \frac{1}{6} \binom{2n+5}{n+1} \binom{n+4}{2} - \frac{5}{3} \binom{2n+3}{n} \binom{n+3}{2} \\ &+ \frac{17}{3} \binom{2n+1}{n-1} \binom{n+2}{2} - 6 \binom{2n-1}{n-2} \binom{n+1}{2} - (n+1) \cdot 4^{n-1}. \end{aligned}$$

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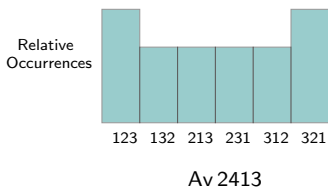
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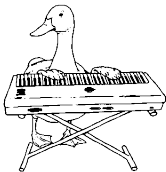
What about multiset permutations?

# Genome Rearrangement

# Evolutionary Distance

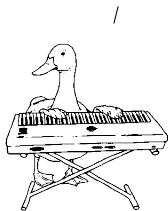


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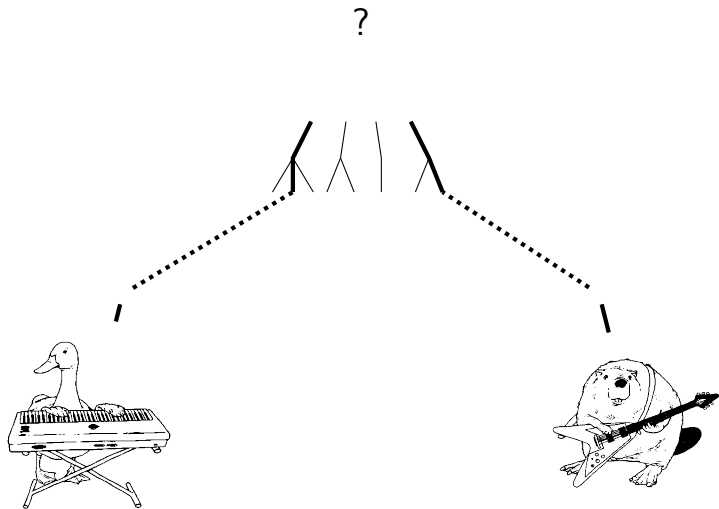


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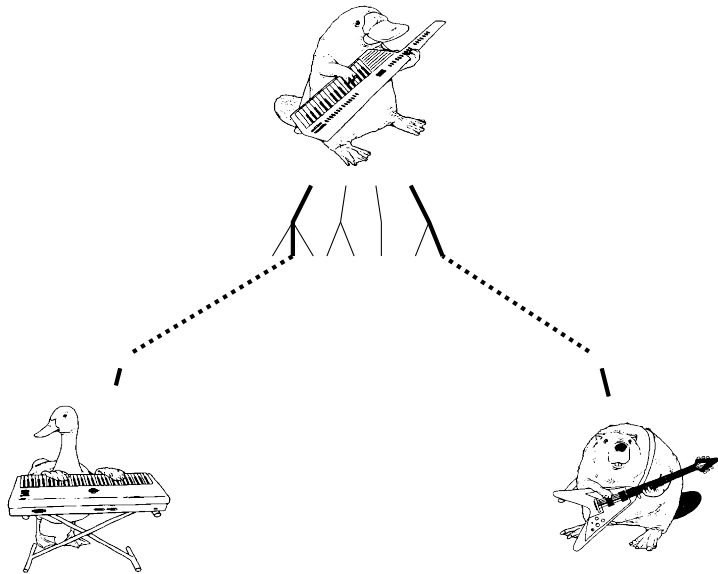
?



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# Genome Rearrangement



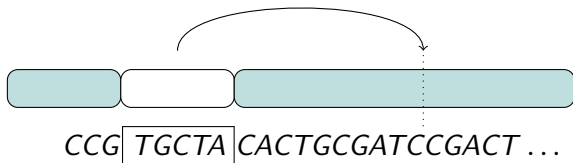
*CCGTGCTACACTGCGATCCGACT ...*

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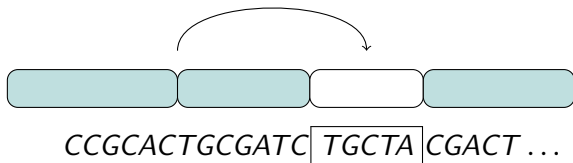


*CCG* *TGCTA* *CACTGCGATCCGACT ...*

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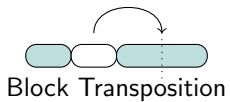


# Genome Rearrangement

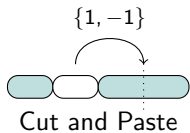
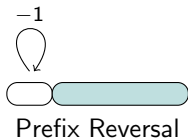
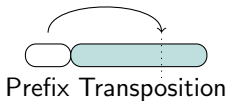
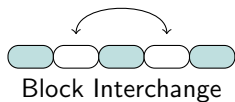
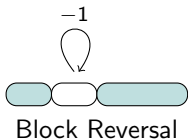
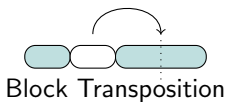




# Block Transformations



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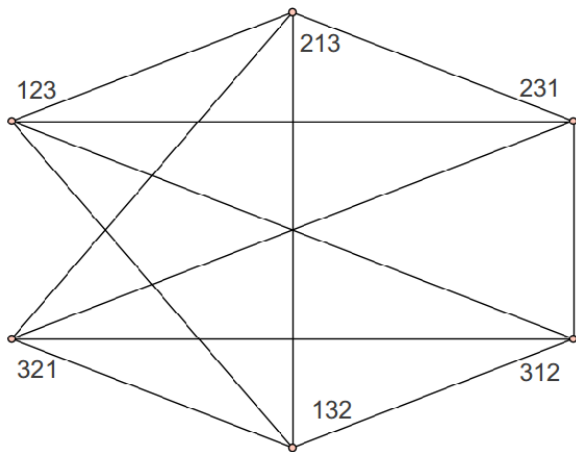
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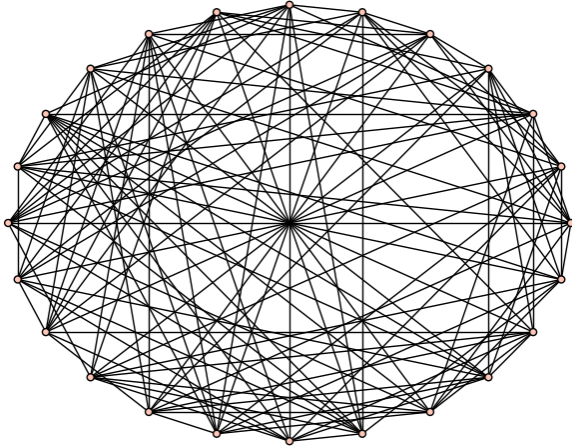
## Question

Given the increasing permutation, how many block transformations does it take to sort it into a given permutation?

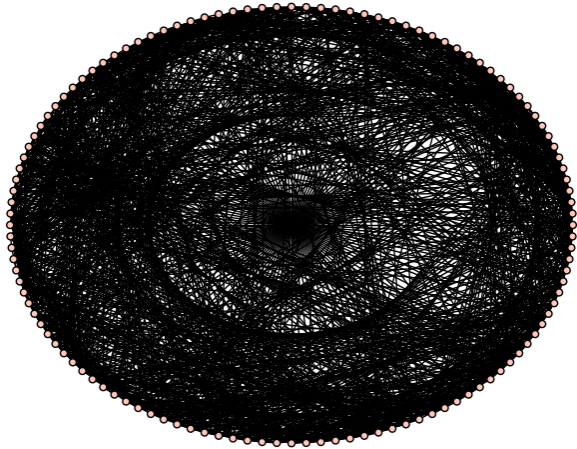
## Example: Block Transpositions



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# Block Transformations and Polynomial Classes

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A *polynomial class* is a class  $\mathcal{C}$  for which  $f(n) = |\mathcal{C}_n|$  is given by a polynomial for large enough  $n$ .

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## Theorem

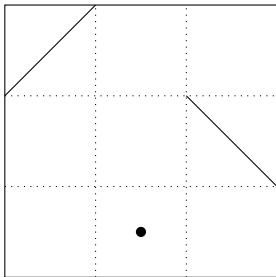
For a given block transformation and a positive integer  $k$ , the set of permutations which are at most  $k$  transformations from the permutation  $123\dots n$  forms a polynomial class.

# Peg Figures

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## Definition

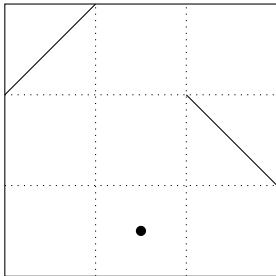
A *peg figure* consists of a grid of increasing and decreasing lines and dots, with one non-empty cell per row and column:



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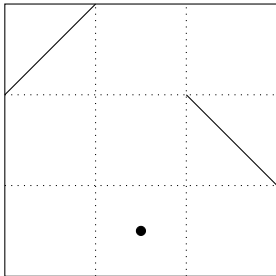
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# Peg Figures

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$$\tilde{\pi} = \overset{+}{3} \overset{\bullet}{1} \overset{-}{2}$$

## Peg Classes

### Definition

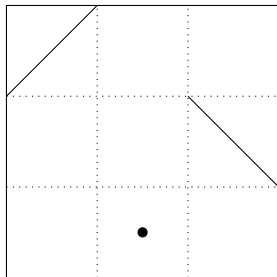
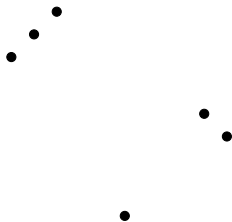
Let  $\mathcal{C}(\tilde{\pi})$  denote the class of permutations which can be drawn on the figure corresponding to  $\tilde{\pi}$ .



# Peg Classes

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$$456132 \in \mathcal{C}(\overset{+}{3}\overset{\bullet}{1}\overset{-}{2})$$

# Polynomial Classes

## Theorem (Vatter et. al.)

A permutation class is a polynomial class if and only if it can be expressed as the union of classes of the form  $\mathcal{C}(\tilde{\pi})$ .

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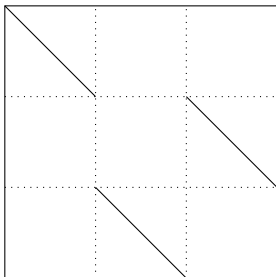
## Algorithm

Takes peg permutations as input, and returns the polynomial enumerating the class.

Example:  $Av(123, 231)$

Fact

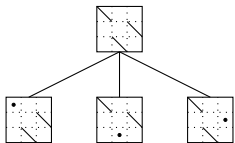
The class  $Av(123, 231)$  is equal to the peg class  $\mathcal{C}(\overline{\overline{312}})$ .



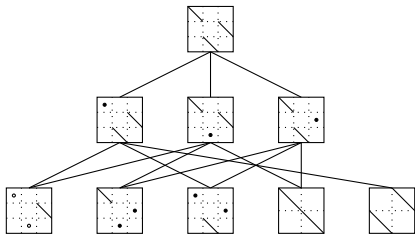
Example:  $Av(123, 231)$



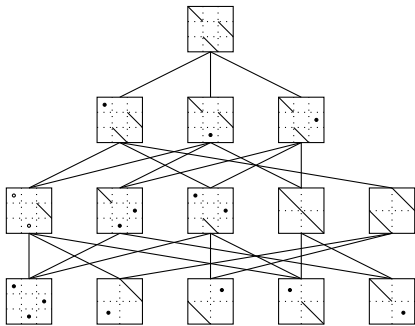
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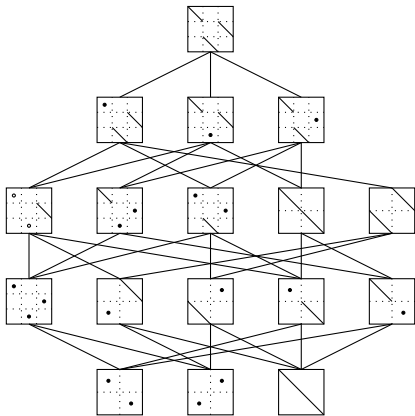


Example:  $Av(123, 231)$

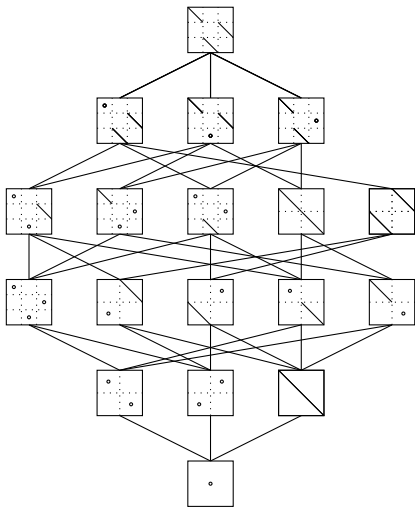




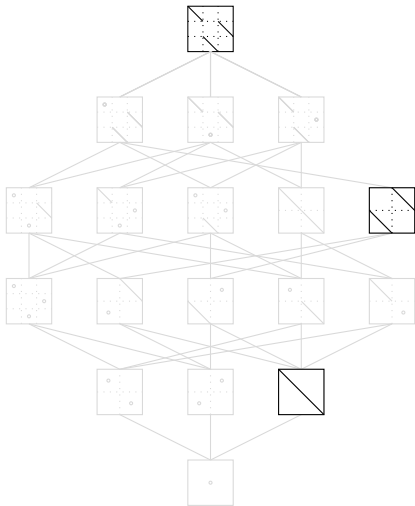
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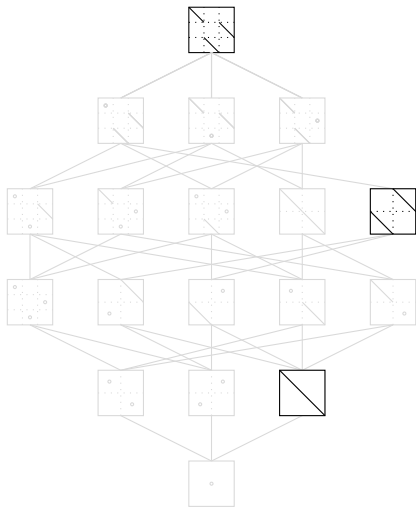
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$$\frac{z^3}{(1-z)^3}$$

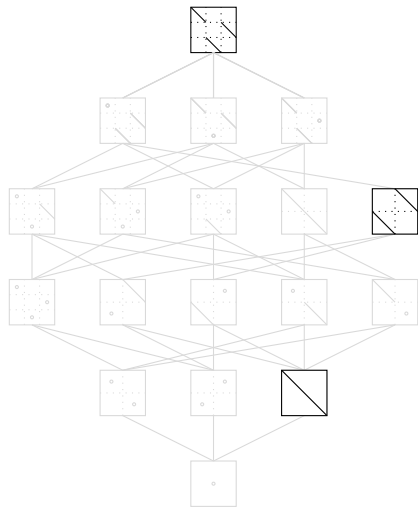
+

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# Example: $Av(123, 231)$



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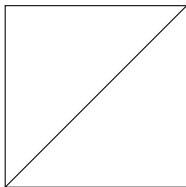
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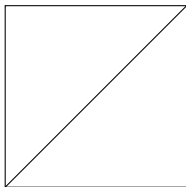
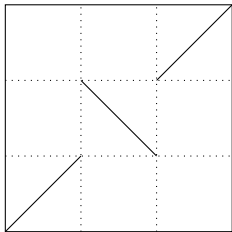
$$\frac{z}{(1-z)}$$

$$|Av_n(123, 231)| = \frac{1}{2}(n^2 - n + 2)$$

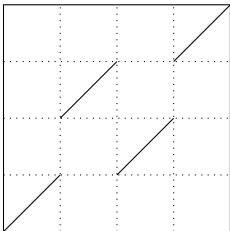
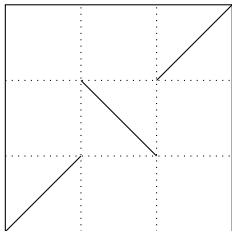
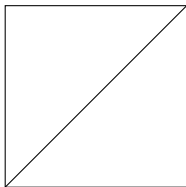
## Example: One Mutation



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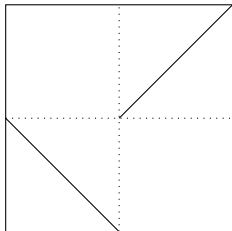
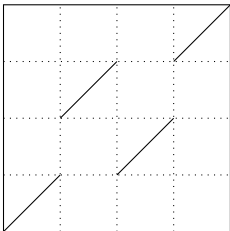
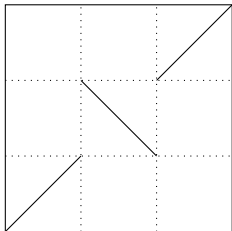
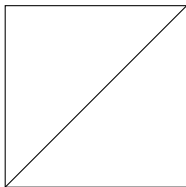


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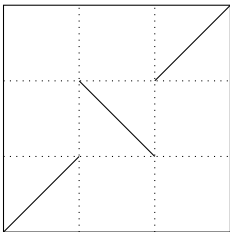




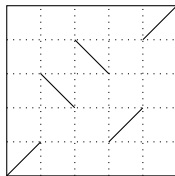
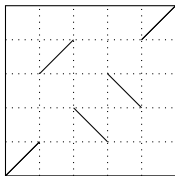
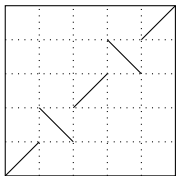
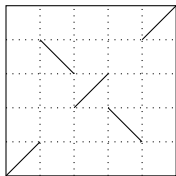
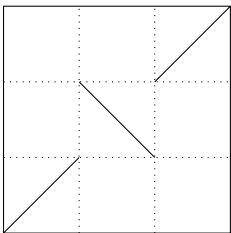
## Example: One Mutation



## Two Block Reversals



## Two Block Reversals



# Computation

## Example

```
>>> C = PolyClass.block_reversal(2)
>>>
>>> C.top_level
  {+1-3-4+2+5, +1+4-2-3+5, +1-2+3-4+5, +1-4+3-2+5}
>>>
>>> C.genfcn()
  
$$-(x^7 - x^6 - 3x^5 + 7x^4 - 4x^3 + 7x^2 - 4x + 1)/(x - 1)^5$$

>>>
>>> C.polynomial()
  
$$8 + -19/6n^1 + 1/3n^2 + -1/3n^3 + 1/6n^4$$

>>>
>>> C.sequence(10)
  1, 1, 2, 6, 22, 63, 145, 288, 516, 857
```

# Combinatorial Testing

# Black Box Testing

## Problem

How can you be sure that your new website/satellite/algorithm does what it's supposed to?

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## (Bad) Solution

Try every input, and make sure nothing goes wrong.

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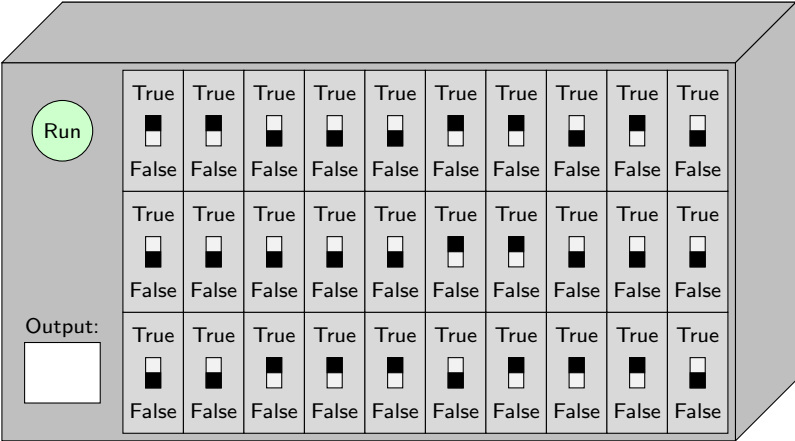
Try *every* input, and make sure nothing goes wrong.

## (Better) Solution

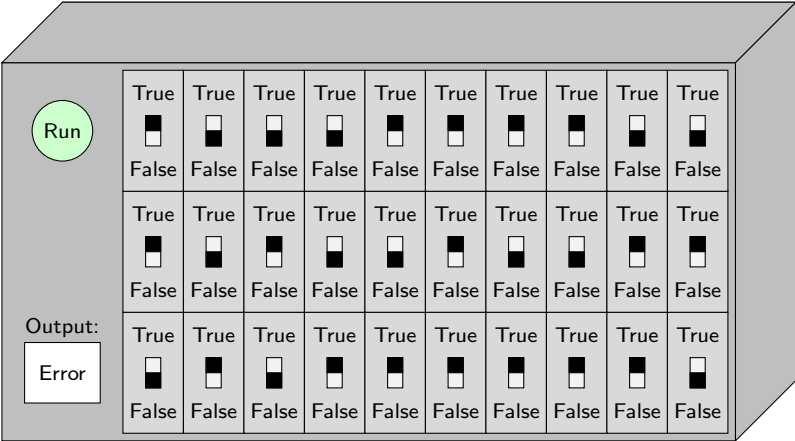
Try *some* inputs, and make sure nothing goes wrong.



# Black Box Testing



# Black Box Testing



$2^{30} > 10^9$  total input combinations

# Parameter Interactions

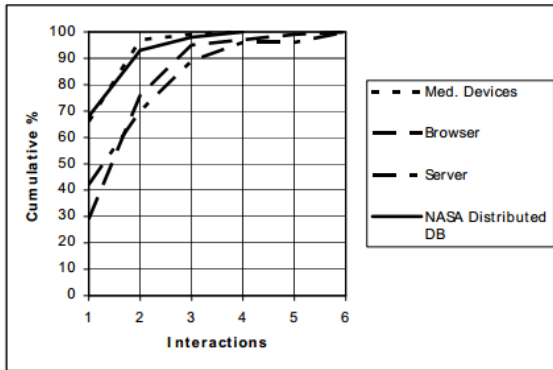
## Idea

Most errors are caused by interactions between relatively few parameters.

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Source: NIST

## Example: Printer

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Paper	Duplex	Color	Content	Orientation
A4	Yes	Yes	Text	Portrait
Letter	No	No	Pictures	Landscape
Legal			Both	

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## Example: Printer

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A4	Yes	Yes	Text	Portrait
Letter	No	No	Pictures	Landscape
Legal			Both	

$$3 \times 2 \times 2 \times 3 \times 2 = 56 \text{ combinations}$$

### Example

Suppose that printing two-sided color landscape pictures on legal paper breaks the printer. . .



## Example: Printer Tests

	paper	duplex	color	content	orientation
1	a4	false	false	text	landscape
2	a4	true	true	pictures	portrait
3	a4	false	true	both	landscape
4	letter	true	false	text	portrait
5	letter	false	true	pictures	landscape
6	letter	true	false	both	portrait
7	legal	false	true	text	portrait
8	legal	true	false	pictures	landscape
9	legal	false	false	both	portrait

## Example: Printer Tests

	P1	P2	P3	P4	P5
1	1	0	0	0	1
2	1	1	1	1	0
3	1	0	1	2	1
4	2	1	0	0	0
5	2	0	1	1	1
6	2	1	0	2	0
7	3	0	1	0	0
8	3	1	0	1	1
9	3	0	0	2	0

# Covering Arrays

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## Problem

Represent a system with  $k$  parameters by a sequence  $(p_1, p_2, \dots, p_k) \in \mathbb{N}^k$  where  $p_i$  denotes the number of variables for the  $i$ th parameter. (the printer is represented by  $(3, 2, 2, 3, 2)$ )

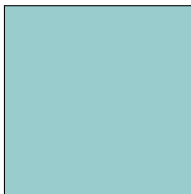
Want to construct a sequence of tests which covers every 2-way interaction between variables. That is, want an  $l \times k$  array  $\mathcal{A}$  such that, for every  $1 \leq i < j \leq k$  and every pair  $(v, w) \in \{1, \dots, p_i\} \times \{1, \dots, p_j\}$ , there exists some  $1 \leq r \leq l$  with

$$\mathcal{A}_{r,i} = v \text{ and } \mathcal{A}_{r,j} = w.$$

# IPO Algorithm

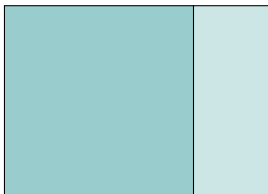
# IPO Algorithm

$p_1 p_2 \dots p_k$



# IPO Algorithm

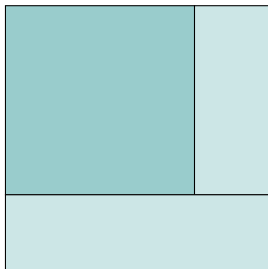
$p_1$   $p_2 \dots p_k$        $p_k$



Horizontal Growth

# IPO Algorithm

$p_1$   $p_2 \dots p_k$        $p_k$

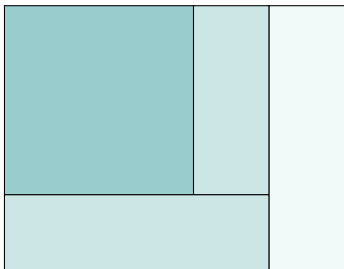


Vertical Growth



# IPO Algorithm

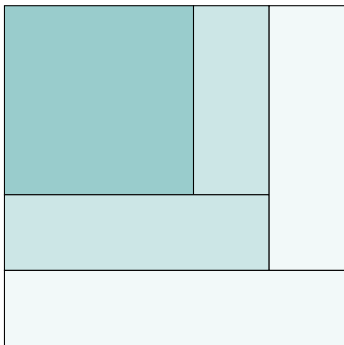
$p_1$   $p_2 \dots p_k$        $p_k$      $p_{k+1}$



Horizontal Growth

# IPO Algorithm

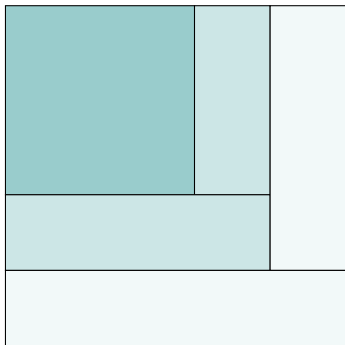
$p_1$   $p_2 \dots p_k$        $p_k$        $p_{k+1}$



Vertical Growth

# IPO Algorithm

$p_1$   $p_2 \dots p_k$        $p_k$      $p_{k+1}$



etc.

# IPO Algorithm

$p_1$	$p_2$
0	0
0	1
1	1
1	0

# IPO Algorithm

$p_1$	$p_2$	$p_3$
0	0	0
0	1	1
1	1	0
1	0	1

# IPO Algorithm

$p_1$	$p_2$	$p_3$	$p_4$
0	0	0	0
0	1	1	1
1	1	0	1
1	0	1	1

# IPO Algorithm

$p_1$	$p_2$	$p_3$	$p_4$
0	0	0	0
0	1	1	1
1	1	0	1
1	0	1	1
1	1	1	0

# IPO Algorithm

$p_1$	$p_2$	$p_3$	$p_4$	$p_5$
0	0	0	0	0
0	1	1	1	1
1	1	0	1	0
1	0	1	1	0
1	1	1	0	1



# IPO Algorithm

$p_1$	$p_2$	$p_3$	$p_4$	$p_5$
0	0	0	0	0
0	1	1	1	1
1	1	0	1	0
1	0	1	1	0
1	1	1	0	1
1	0	0	0	1

# IPOG Algorithm

## Definition

A *strength*  $t$  covering array is one in which every  $t$ -way combination of variables appears in at least one row.

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## Approximate Size

The number of tests is a minimal covering array of strength  $t$  for a system with  $n$  parameters, each of which having  $v$  variables, is

$$v^t \log(n).$$

Questions?

Thanks for listening!