# Concentration in order types of random point sets

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The pitch:

▷ a (labeled) order type is a combinatorial object induced by a finite set of points in  $\mathbb{R}^2$ .

I'd like to know to generate randomly such an object without excessive bias.

▷ Here, I'll discuss why sampling random point sets can be **inefficient**.

# Order types & labeled order types

Jacob E. Goodman





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→ what you know is the **order**, or **permutation**, of the points.



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 → Identifying up to relabeling creates one equivalence class.



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 → Identifying up to relabeling creates one equivalence class.

As of dimension 2, the structure gets richer and more intricate.

to finitely many combinatorial types based on orientation predicates.

[Goodman-Pollack'83]

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$$\chi : (\mathbb{R}^2)^3 \to \{-1, 0, 1\}$$

$$\sum_{\substack{\mathbf{o} \\ \mathbf{o} \\ a}} \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{a} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{a} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{a} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{a} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{a} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{a} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{a} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{a} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{a} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{a} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{a} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{a} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{a} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{a} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{a} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \\ \mathbf{o} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \\ \mathbf{o} \end{array} \right) \left( \begin{array}{c} \mathbf{o} \end{array} \right)$$

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Two point sequences  $p_1, p_2, \ldots, p_n$  and  $q_1, q_2, \ldots, q_n$  such that

$$\forall 1 \leq i, j, k \leq n, \quad \chi(p_i, p_j, p_k) = \chi(q_i, q_j, q_k)$$

have the same labeled order type.

Equivalence relation, class  $\simeq$  map: triples of indices  $\rightarrow \{-1, 1\}$ .

Example: representatives of the labeled order types of size 4.



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How many *n*-point labeled order types are there?  $n^{4n+o(n)}$ .

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n = 4



#### **Discrete geometers**

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Two point sets P and Q have the same order type if there exists an orientation-preserving bijection between them.

Equivalence relation, order type  $\stackrel{\text{\tiny def}}{=}$  an equivalence class.

Common properties for convex hull, segments intersections, ...

Can be defined **abstractly** in **topological affine planes**.

Labeled abstract order types = acyclic uniform oriented matroids.

[Salzmann'67][Folkman-Lawrence'78]





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#### but realizable OT are complicated.

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Realizable OT were **enumerated** up to size 11.





 3
 4
 5
 6
 7
 8
 9
 10
 11

 1
 2
 3
 16
 135
 3 315
 158 817
 14 309 547
 2 334 512 907

(mirror images are identified)

9 - 3

[Aichholzer-Aurenhammer-Krasser'02]

## Sampling order types

Not mere intellectual curiosity...

▷ Tool to test problems/conjectures expressible by orientation predicates.

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▷ Testing geometric algorithms (that use only orientation predicates).

No need to test the same trace twice.
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that encodes a labeled order type.

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Take random samples of size 10 in  $[1,2]^2$  and record the set of order types seen. Measure the rate of discovery and the redundancy.

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The last million samples reach only 2 500 new order types.

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Our "concentration" result:

There is a **vanishingly small** subset  $A_n$  of the *n*-point order types such that a random *n*-point i.i.d. sample of a square has order type in  $A_n$  with probability  $\rightarrow 1$ . Random polygons based on order types

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How many extreme points in a random **order type** chosen **equiprobably** among the *n*-point order types?

Answer:  $\sim 4$  as  $n \rightarrow \infty$ .

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 $\mathbb{E}\left[Z_n\right] = \Theta(\log n)$ 





# Our main results

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**Theorem.** For  $n \ge 3$ , the number of extreme points in a random simple labeled order type chosen uniformly among the simple, labeled order types of size n in the plane has average  $4 - \frac{8}{n^2 - n + 2}$  and variance less than 3.

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- ▷ Account for symmetries.

## Averaging on subsets



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We further **divide up** order types into classes of order types equal **up to projective transforms**.

Then, we average the number of extreme points within each class.

## Projective order types









## Invariance under affine transforms



Invariance under affine transforms



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 $\infty$ 





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Invariance under **affine transforms**  $\Rightarrow$  the only choice is which line is sent to infinity.



21 - 13  $\chi(a,b,c) \stackrel{\text{\tiny def}}{=} \operatorname{sign} \det(a,b,c)$ 





Its "projective closure".



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All order types of "affine hemisets" of that projective closure.



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## Duality



P a projective 2n-point set.




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Affine hemisets of P $\leftrightarrow$  2-cells of the dual arrangement  $P^*$ 

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How can we control the multiplicities?

# Symmetries and labeled order types



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These two biases cancel each other out!







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# Multiplicities, for labeled order types





Classify the affine and projective symmetry groups



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### Time to wrap-up!

**Conjecture.** Order types of n i.i.d. points whose number of extreme points goes to  $\infty$  as  $n \to \infty$  exhibit concentration.

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Polynomial time per sample + not too biased.

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**Question.** Is it true that for any order type  $\tau$ , the proportion of *n*-point order types that avoid  $\tau$  goes to 0 as  $n \to \infty$ ?



### Thank you for your attention!





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 $\triangleright$  Affine order types have 4 + o(1) extreme points on average.

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Each of these groups occurs as symmetry group of some projective order type.