

### EuroCG 2020 Ph. D. School on Computational Geometry

## Counting and Enumeration in Geometry

# **Günter Rote** Freie Universität Berlin

Counting and enumeration in geometry

### Triangulations of a point set









a point set

### two triangulations



### Triangulations of a point set



a point set

two triangulations

COUNT: How many triangulations does a given point set have? SAMPLE: Generate a random triangulation (uniformly) ENUMERATE (list, visit) all triangulations of a given point set. OPTIMIZE: Find the "best" triangulation of a given point set. EXTREMAL QUESTION: How many triangulations can a set of points have? at most? at least?

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### Other noncrossing geometric structures



a point set

two non-crossing perfect matchings

- triangulations
- non-crossing spanning trees
- non-crossing Hamiltonian cycles
- non-crossing matchings
- non-crossing perfect matchings
- . .
- [your favorite straight-line geometric graph structure]

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Given a set of n points in the plane (in general position), how many

- triangulations
- non-crossing spanning trees
- non-crossing Hamiltonian cycles
- non-crossing matchings
- non-crossing perfect matchings
- . .
- [your favorite straight-line geometric graph structure]

can it have, at most? (at least?)

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Plane Graphs	$\Omega(42.11^N)$	[HPS18]	$O(187.53^{N})$	[SS12]	Recen	t Comments
Triangulations	$\Omega(8.65^N)$	[DSST11]	$30^{N}$	[SS11]		Pascal on An
Spanning Cycles	$\Omega(4.64^N)$	[GNT00]	$O(54.55^{N})$	[SSW13]	2 <sup>86</sup>	with Mini
Perfect Matchings	$\Omega(3.09^N)$	[AR15]	$O(10.05^{N})$	[SW06]	А	Ajmain Yamir Teenagers do Mathematica
Spanning Trees	$\Omega(12.52^N)$	[HM13]	$O(141.07^{N})$	[HSSTW11; SS11]		Adam Sheffer Points in General Posit
Cycle-Free Graphs	$\Omega(13.61^N)$	[HM13]	$O(160.55^N)$	[HSSTW11; SS11]		r57shell on Po in General Po
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### Optimization



Given a set of points, find the triangulation that

- has the smallest total edge length
- minimizes the largest angle
- maximizes the smallest angle
- maximizes the total area of all triangles
- minimizes the total *squared* edge length
- is a good spanner
- . .

Enumerating all triangulations and taking the best one always works.

### Optimization

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Given a set of points, find the triangulation that

- has the smallest total edge length NP-hard, quasipolynomial
- minimizes the largest angle polynomial
- maximizes the smallest angle <sup>Delaunay</sup>
- maximizes the total area of all triangles <sup>easy</sup>
- minimizes the total *squared* edge length??
- is a good spanner??
- . .

Enumerating all triangulations and taking the best one always works.

### Overview

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- 0. Introduction
- 1. Count triangulations [ Alvarez and Seidel, 2013 ]
  - and perfect matchings [Wettstein, 2014]
  - Optimal triangulations
- Coordinated primal-dual sweep
  [Biedl, Chambers, Kostitsyna, Rote, Felsner, 2020]
- Count perfect matchings of structured point sets
  [ Asinowski and Rote, 2018 ]
- 4. Production matrices [ Huemer, Pilz, Seara, Silveira, 2016 ]

## 1. Count Triangulations



#### Count, sample, enumerate

#### triangulation



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![](_page_26_Figure_0.jpeg)

![](_page_27_Figure_0.jpeg)

![](_page_28_Picture_1.jpeg)

![](_page_28_Figure_2.jpeg)

N(v) := #paths from source to vCompute N(v) from source to sink.

![](_page_29_Picture_1.jpeg)

![](_page_29_Figure_2.jpeg)

N(v) :=#paths from source to vCompute N(v) from source to sink.

![](_page_30_Picture_1.jpeg)

![](_page_30_Figure_2.jpeg)

N(v) := #paths from source to vCompute N(v) from source to sink.

How to SAMPLE a random path:

![](_page_31_Picture_1.jpeg)

![](_page_31_Figure_2.jpeg)

N(v) := #paths from source to vCompute N(v) from source to sink.

How to SAMPLE a random path:

![](_page_32_Picture_1.jpeg)

![](_page_32_Figure_2.jpeg)

Compute N(v) from source to sink.

because 21 = 3 + 11 + 7

How to SAMPLE a random path:

![](_page_33_Picture_1.jpeg)

![](_page_33_Figure_2.jpeg)

N(v) := #paths from source to vCompute N(v) from source to sink.

How to SAMPLE a random path:

![](_page_34_Picture_1.jpeg)

![](_page_34_Figure_2.jpeg)

N(v) :=#paths from source to vCompute N(v) from source to sink.

How to SAMPLE a random path:

Find a random number between 1 and 28.

because 7 = 2 + 4 + 1

![](_page_35_Picture_1.jpeg)

![](_page_35_Figure_2.jpeg)

N(v) := #paths from source to vCompute N(v) from source to sink.

How to SAMPLE a random path:
# Counting source-sink paths in a DAG





N(v) := #paths from source to vCompute N(v) from source to sink.

How to SAMPLE a random path:

Find a random number between 1 and 28.

# Counting source-sink paths in a DAG



N(v) :=#paths from source to vCompute N(v) from source to sink.

How to SAMPLE a random path: Find a random number between 1 and 28.

Essentially, this is UNRANKING: Compute a function  $\{1, \ldots, N\} \rightarrow \text{path}$ 

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# Summary



The number of triangulations can be found in  $O(n^2 2^n)$  time and  $O(n2^n)$  space.

With this much preprocessing and space:

- The triangulations can be enumerated with O(n) delay.
- A random triangulation can be determined in O(n log n) steps.

WARNING: Have to deal with large numbers. Counting algorithm can use modular arithmetic (Chinese remainder theorem).

Can be applied to other structures (e.g. matchings, Ex. 6)

Can be used for optimizing *decomposable* objective functions. (Nonuniqueness is not an issue.)

# Other algorithms for counting



There are many other approaches (divide-and-conquer, sweep, dynamic programming).

The theoretically fastest algorithm for counting triangulations uses divide-and-conquer, based on balanced separators of size  $O(\sqrt{n})$  and has supexponential runtime:

 $n^{O(\sqrt{n})}$ 

Also for counting other structures.

["cactus layers", Marx and Miltzow, 2016]

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- plane directed acyclic graph
- a single source s and a single sink t







- plane directed acyclic graph
- a single source s and a single sink t
- split the outer face:
- $\rightarrow$  dual graph with a *left* outer vertex s' and a *right* vertex t'
  - The dual graph is also a bipolar orientation. (may be a multigraph)

t'



- plane directed acyclic graph
- a single source s and a single sink t
- split the outer face:
- $\rightarrow$  dual graph with a *left* outer vertex s' and a *right* vertex t'
  - The dual graph is also a bipolar orientation. (may be a multigraph)
  - All faces in the overlay of the two graphs are quadrilaterals:



sweep over the *leftmost* possible face

s'

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sweep over the *leftmost* possible face

s'

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sweep over the *leftmost* possible face

s'

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 sweep the primal graph with an s-t rope from left to right





 sweep the primal graph with an s-t rope from left to right





 sweep the primal graph with an s-t rope from left to right





 sweep the primal graph with an s-t rope from left to right

sweep over the *lowest* possible face





 sweep the primal graph with an s-t rope from left to right

sweep over the *lowest* possible face

# Animation





page.mi.fu-berlin.de/rote/Papers/slides/Wuerzburg-2020-Simultaneous-sweep-Animation.pdf



There is a (unique) coordinated primal-dual sweep with the following properties:

- The primal rope always crosses the dual rope exactly once.
- The primal and the dual rope stay "close" to each other.
- Exactly one rope can advance, depending on the situation at the crossing.
- Every primal-dual edge pair is visited exactly once.
- Each individual sweep is a leftmost/bottommost sweep.

[Biedl, Chambers, Kostitsyna, Rote, Felsner 2020] in connection with sweeping over a pseudoline arrangement, see Ex. 4.



































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\* = up to a polynomial factor


smallest possible number of perfect matchings:  $\Theta^*(2^n)$ 

[García, Noy, Tejel 2000]

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#### [Sharir, Welzl 2006]

Upper bound:  $O^*(10.06^n)$ 

```
* = up to a polynomial factor
```

Current lower bound record:

The generalized double-zigzag chain



 $r = 8: \Theta^*(3.0930^n)$ 

#### [Asinowski and Rote 2018]

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Current lower bound record:

The generalized double-zigzag chain



 $r = 8: \Theta^*(3.0930^n)$  [Asinowski and Rote 2018]

```
Here: r = 3 without corners: \Theta^*(3.037^n)
```

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Current lower bound record:

The generalized double-zigzag chain



 $r = 8: \Theta^*(3.0930^n)$  [Asinowski and Rote 2018]

```
Here: r = 3 without corners: \Theta^*(3.037^n)
```

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#### Perfect matchings in double-X







# Perfect matchings in double-X Freie Universität Berlin matching with k edges Pn-2k unique edges k-() matching with k edges |P| = |Q| = n

### Perfect matchings in double-X





# More general "flat" X

P



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Must count only *down-free* matchings of P:

The unmatched points must be visible from below!

# **Dynamic Programming Recursion**

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 $X_A^n = \#$  possibilities after n arcs with A dangling edges

# **Dynamic Programming Recursion**

 $X_5^{n+1} = X_2^n + 3X_3^n + 7X_4^n + 6X_5^n + 7X_6^n + 3X_7^n + X_8^n$  $\begin{pmatrix} 3 & 6 & 3 & 1 & 0 & 0 & 0 & 0 \\ 6 & 6 & 7 & 3 & 1 & 0 & 0 & 0 \\ 3 & 7 & 6 & 7 & 3 & 1 & 0 & 0 \\ 1 & 3 & 7 & 6 & 7 & 3 & 1 & 0 \\ 0 & 1 & 3 & 7 & 6 & 7 & 3 & 1 \\ 0 & 0 & 1 & 3 & 7 & 6 & 7 & 3 \\ 0 & 0 & 0 & 1 & 3 & 7 & 6 & 7 \\ 0 & 0 & 0 & 0 & 1 & 3 & 7 & 6 \\ \end{pmatrix}$  $X_{1}^{n} X_{1}^{n+1} \\ X_{2}^{n+1} \\ X_{3}^{n+1} \\ X_{5}^{n+1} \\ X_{6}^{n+1} \\ X_{7}^{n+1} \\ X_{8}^{n+1}$ total #points row sum  $28 \Longrightarrow$  vectors grow like  $28^n/n^{3/2} \Longrightarrow \Theta^*(3.037^N$ [ Banderier and Flajolet, 2002 ]

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### Weighted lattice paths





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3



Triangulation of (n + 1)-gon with last vertex of degree

Triangulation of *n*-gon with last vertex of degree  $d_n = d$   $\rightarrow$ 

4. Triangulations of a convex *n*-gon



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Counting and enumeration in geometry

Fig. 4. Levels three to six of the tree of triangulations.

# 4. Triangulations of a convex *n*-gon

Triangulation of *n*-gon with last vertex of degree  $d_n = d \rightarrow$ 

Triangulation of (n + 1)-gon with last vertex of degree





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 $\rightarrow$ 

$$d_{n+1} = 2 \text{ or } 3 \text{ or } 4 \text{ or } \dots \text{ or } d, \text{ or } d+1$$
[ Hurtado & Noy 1999 ]
"tree of triangulations"
$$triangulation$$

$$1$$
lattice path

Triangulation of (n + 1)-gon with last vertex of degree

Triangulation of *n*-gon with last vertex of degree  $d_n = d$ 

4. Triangulations of a convex n-gon



### Production matrices





# Production matrices for enumeration



were introduced by Emeric Deutsch, Luca Ferrari, and Simone Rinaldi (2005).

were used for counting noncrossing graphs for points in convex position: Huemer, Seara, Silveira, and Pilz (2016) Huemer, Pilz, Seara, and Silveira (2017)



#### Making the degree finite





### Making the degree finite





#### Other examples: graphs, paths



#### geometric graphs

paths

#### Huemer, Seara, Silveira, and Pilz (2016) Huemer, Pilz, Seara, and Silveira (2017)

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#### Other examples: graphs, paths





Huemer, Seara, Silveira, and Pilz (2016) Huemer, Pilz, Seara, and Silveira (2017)