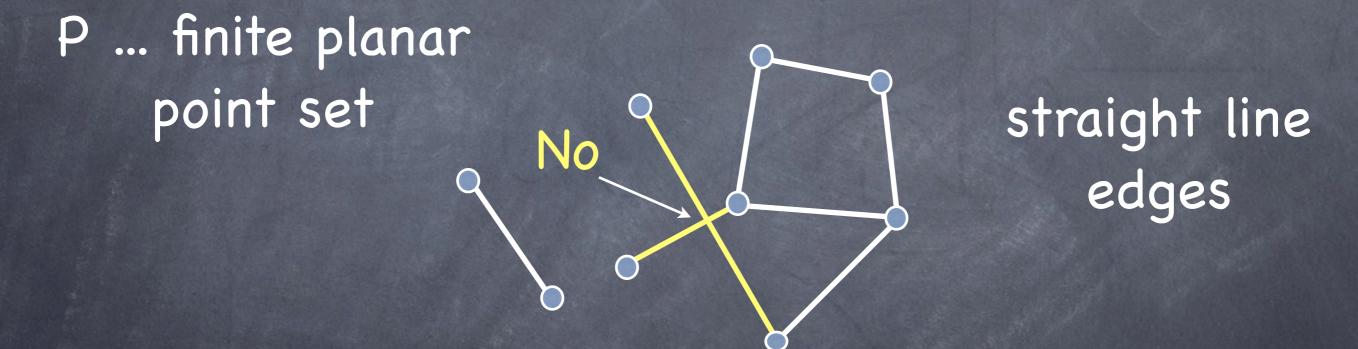
On the Number of Crossing-Free Configurations on Planar Points Sets

Emo Welzl, ETH Zürich

Algorithmic and Combinatorial Geometry Alfréd Rényi Institute of Mathematics, Budapest June 16, 2009 On the Number of Crossing-Free Configurations on Planar Points Sets

> Counting specific – extremal – algorithmic



no crossings – no edge through point

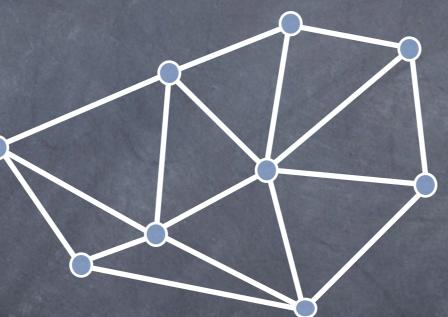
P ... finite planar point set Noviet edges

#### no crossings - no edge through point



no crossings - no edge through point

P ... finite planar point set



straight line edges

#### maximal crossing-free: triangulation

## I. (Specific) Counting

The number  $tr(G_{n+2})$  of triangulations of the vertices  $G_{n+2}$  of a convex (n+2)-gon satisfies

 $tr(G_{n+2}) = C_n \approx_n 4^n$ 

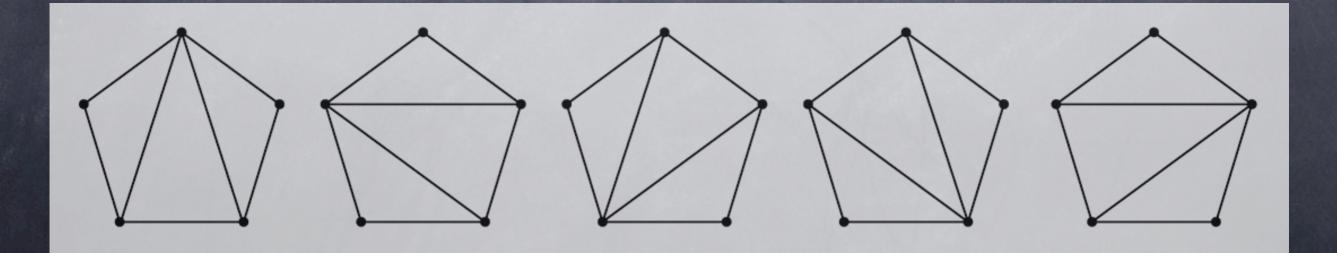
# with $C_n := \frac{1}{n+1} \binom{2n}{n} = \Theta(\frac{1}{n^{3/2}} 4^n)$

Catalan Numbers

## I. (Specific) Counting

The number  $tr(G_{n+2})$  of triangulations of the vertices  $G_{n+2}$  of a convex (n+2)-gon satisfies

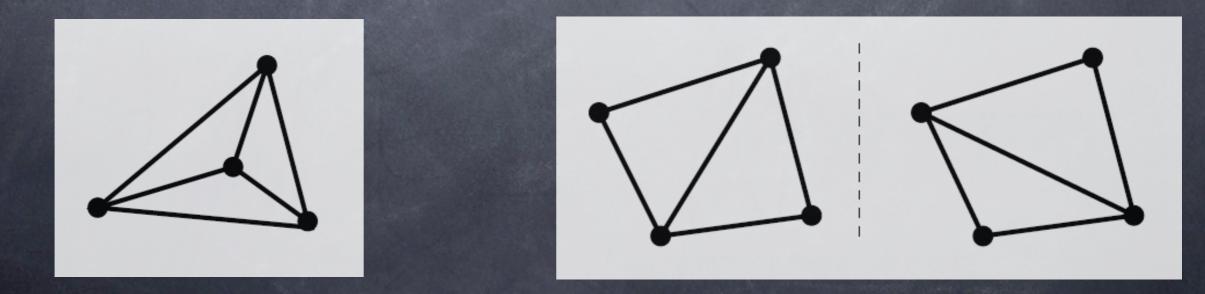
 $tr(G_{n+2}) = C_n \approx_n 4^n$ 



## II. Extremal Counting

The number tr(P) of triangulations of a 4-element point set P satisfies

### $tr_{min}(4) = 1 \leq tr(P) \leq 2 = tr(4)$



### II. Extremal Counting

 $tr(n) := max_{|P|=n} tr(P)$  $tr_{min}(n) := min_{|P|=n} tr(P)$ 

 $tr_{min}(n) \leq_n 4^n \leq_n tr(n)$ 

with P in general position

### III. Algorithmic Counting

The number tr(P) of triangulations of an n-element point set P can be computed in time

### $O(tr(P) \cdot poly(n))$

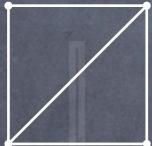
by enumeration

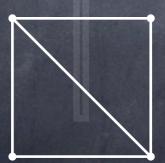
I. (Specific) Counting **1. Triangulations of Convex Polygons** Point Sets in Convex Position

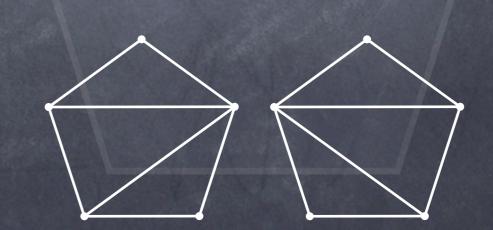
### In how many ways can we triangulate a convex n-gon?

### $P_n:=tr(G_n)$

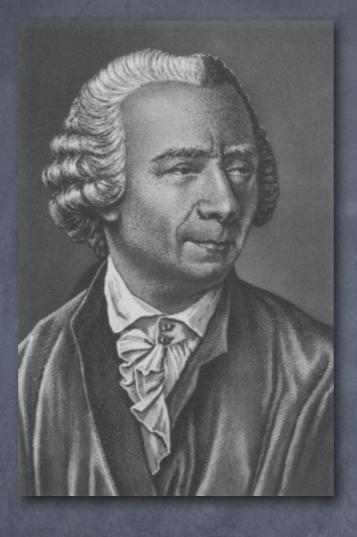
 $P_2 = 1$ ,  $P_3 = 1$ ,  $P_4 = 2$ ,  $P_5 = 5$ 

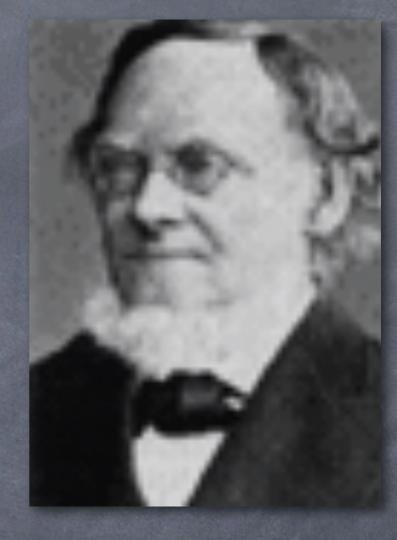






#### Started with a letter in 1751: Euler to Goldbach





#### Leonhard Euler 15.4.1707 Basel 18.9.1783 St. Petersburg

Christian Goldbach 18.3.1690 Königsberg 20.11.1764 Moscow

#### Euler computed these numbers up to 10-gons ...

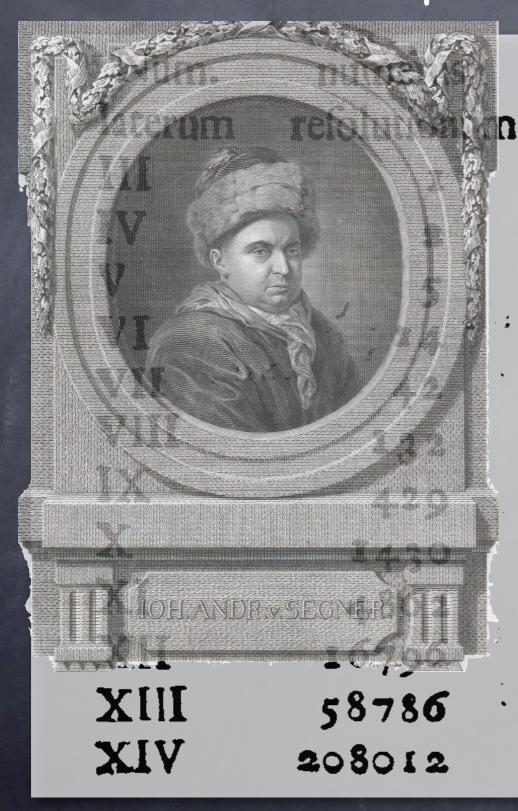
schehen könne. Setze ich nun die Anzahl dieser verschiedenen Arten  $\equiv x$ , so habe ich per inductionem gefunden wenn  $n \equiv 3, 4, 5, 6, 7, 8, 9, 10$ so ist  $x \equiv 1, 2, 5, 14, 42, 132, 429, 1430.$ 

## ... but he considered his method (whatever it was, we don't know) too tedious.

TT!

die folgende leicht gefunden wird. Die Induction aber, so ich gebraucht, war ziemlich mühsam, doch zweifle ich nicht, dass diese Sach nicht sollte weit leichter entwickelt werden können. Ueber die Progression der Zahlen 1, 2, 5, 14,

#### 1758 Segner set up the "Catalan Recurrence" and computed more numbers.



num. laterum XV XVI XVII XVIII XIX XX IXX XXII XXIII XXIV XXV

### With these numbers Euler saw a conjecture confirmed which he mentioned already in his letter to Goldbach:

"Ita si pro polygno n laterum numerus resolutonum sit P pro polygono sequente n+1 laterum resolutionum erit "

$$P_{n+1} := \frac{4n-6}{n}P_n$$

#### but he has little hope to prove that

Auctori huius schediasmatis non displicaturum esse speramus

It took 80 years until Gabriel Lamé (according to Gauss the best French mathematician of his time) proved Euler's conjecture in 1838.

Note sur une Equation aux différences finies;

PAR E. CATALAN.

M. Lamé a démontré que l'équation

 $P_{n+1} = P_n + P_{n-1}P_3 + P_{n-2}P_4 + \dots + P_4P_{n-2} + P_3P_{n-1} + P_n, \quad (1)$ se ramène à l'équation linéaire très simple,

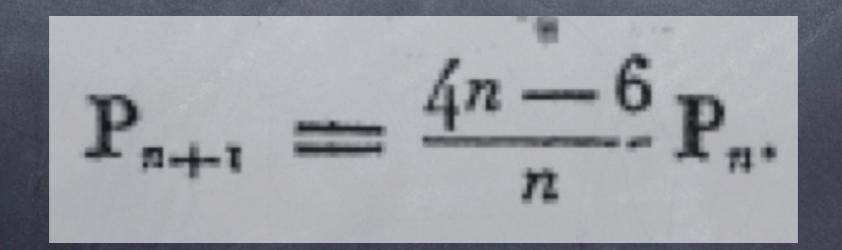
$$P_{n+2} = \frac{1}{n+1} \binom{2n}{n} \Leftarrow \mathbf{P}_{n+1} = \frac{4n-6}{n} \mathbf{P}_n. \tag{2}$$

Admettant donc la concordance de ces deux formules, je vais chercher à en déduire quelques conséquences.

# Proof of the Euler Recurrence

Re

BODE



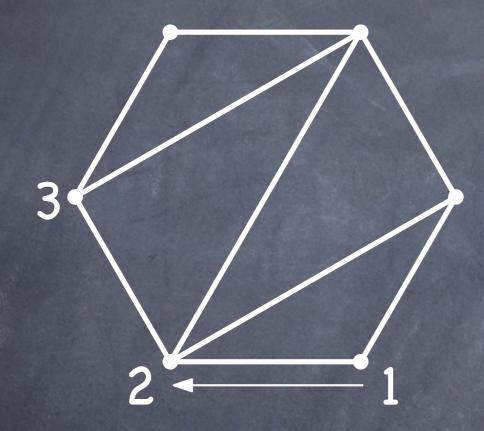
#### Multiply-decorate-biject

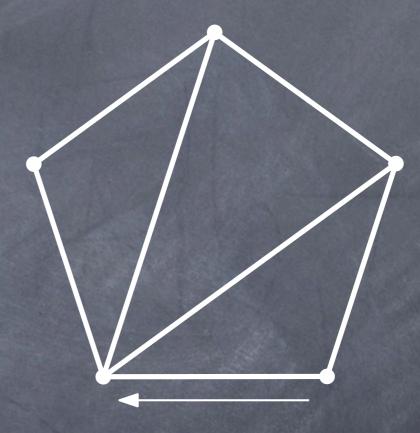
 $P_{n+1} = \frac{4n-6}{n} P_n$ 



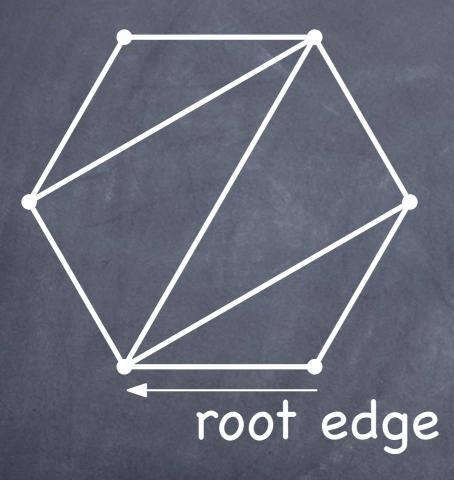
## $n P_{n+1} = 2(2n - 3) P_n$

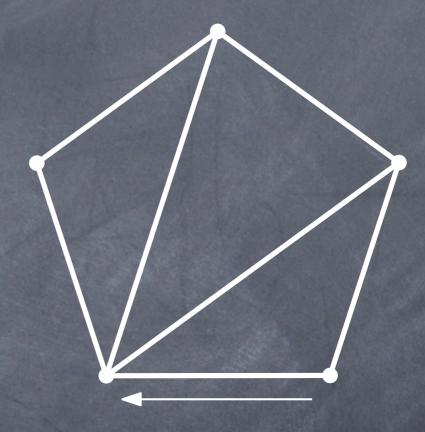
# Multiply-decorate-biject $n P_{n+1} = 2(2n-3) P_n$



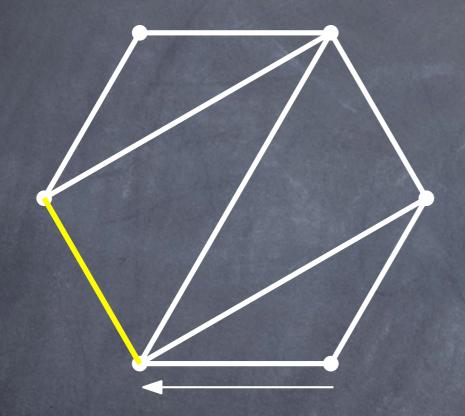


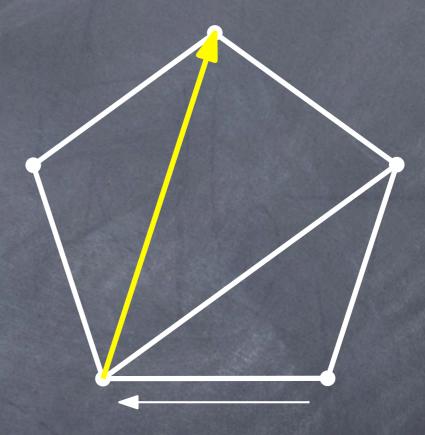
### Multiply-decorate-biject $n P_{n+1} = 2(2n-3) P_n$





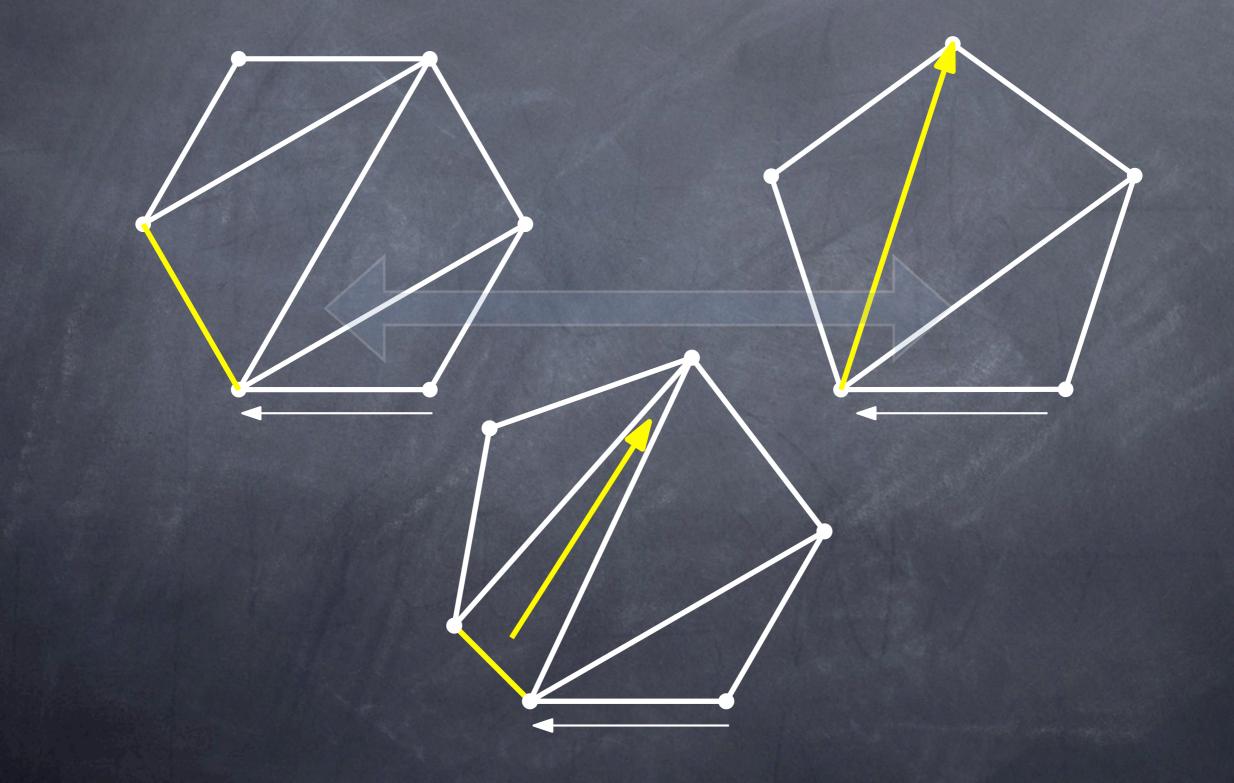
### Multiply-decorate-biject $n P_{n+1} = 2(2n-3) P_n$



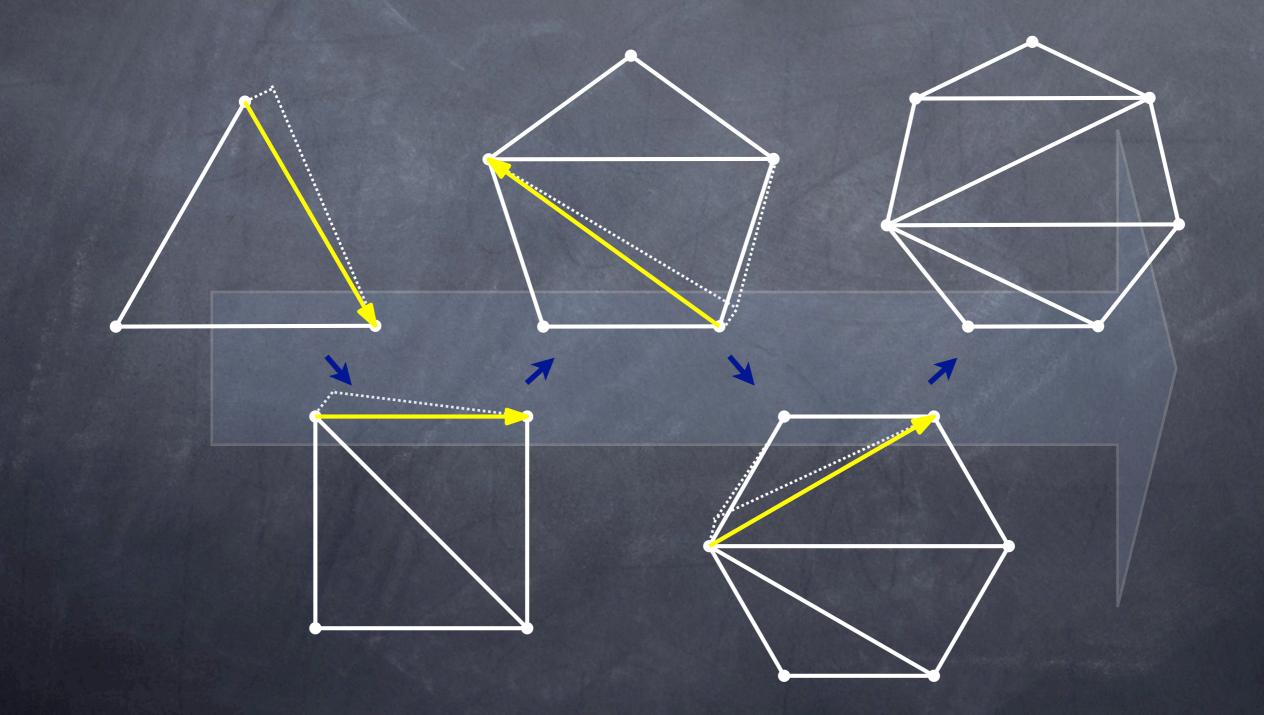


decorate boundary edge not root edge decorate any edge and orient

# Multiply-decorate-biject $n P_{n+1} = 2(2n-3) P_n$



The proof of the recurrence exhibits an elegant evolution of a uniformly random triangulation: (choose random edge, orient randomly, expand)\*



Why did Euler write to Goldbach about this problem?

Question may have its roots in surveying.

Why did Euler write to Goldbach about this problem? But here is what he found quite remarkable "nicht wenig merkwürdig"

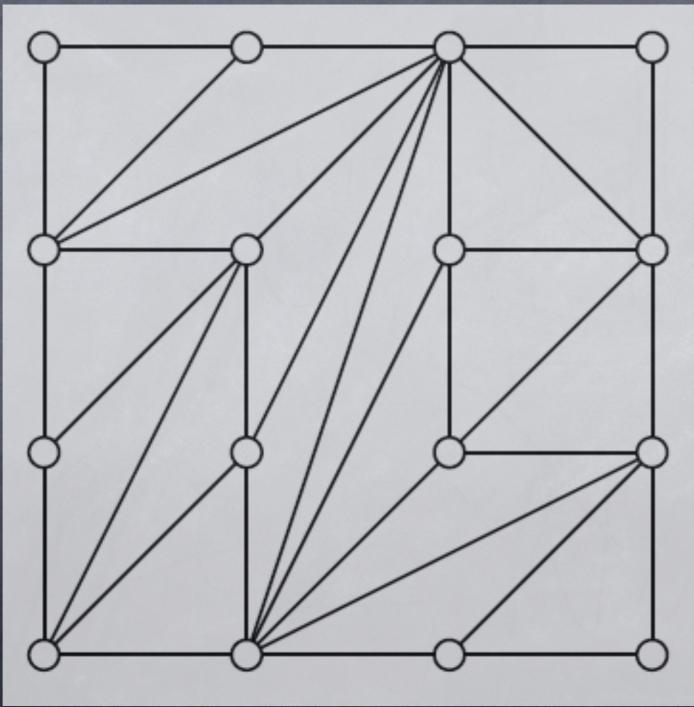
können. Ueber die Progression der Zahlen 1, 2, 5, 14, 42, 132, etc. habe ich auch diese Eigenschaft angemerket, dass  $1 + 2a + 5a^2 + 14a^3 + 42a^4 + 132a^5 + \text{etc.} = \frac{1-2a-\sqrt{(1-4a)}}{2aa}$ . Also wenn  $a = \frac{1}{4}$ , so ist  $1 + \frac{2}{4} + \frac{5}{4^2} + \frac{14}{4^3} + \frac{42}{4^4} + \text{etc.} = 4$ .

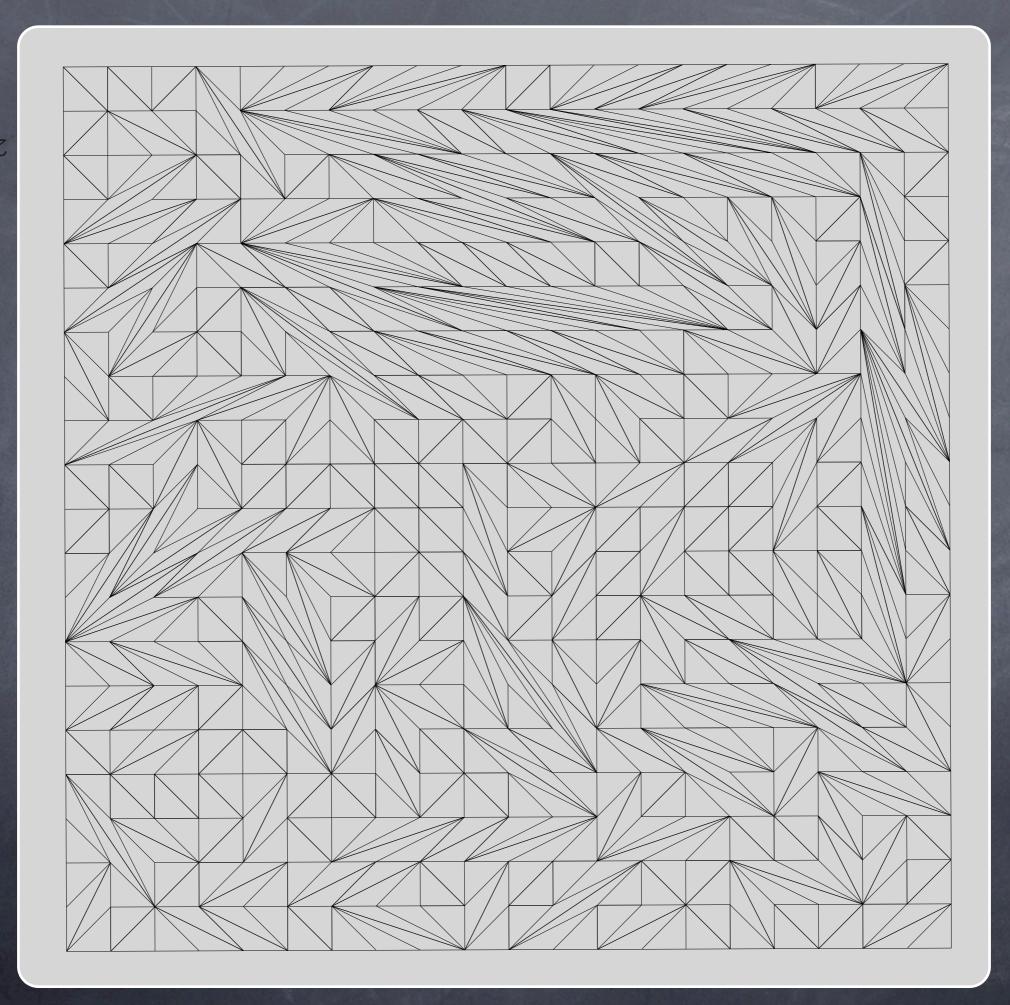
Euler.

## I. (Specific) Counting 2. Lattice Triangulations

### n×n Lattice: $L_{n\times n} = \{0,1,...,n\}^2$ (n+1)<sup>2</sup> points







## Bounds on $tr(L_{n \times n})$

- O(64<sup>n<sup>2</sup></sup>) [Orevkov'99]
- $O(8^{n^2})$  [Anclin'02]
- $\Omega(4.15^{n^2})$  [Kaibel,Ziegler'02]
- O(6.86<sup>n<sup>2</sup></sup>) [Matoušek, Valtr, Welzl'06]

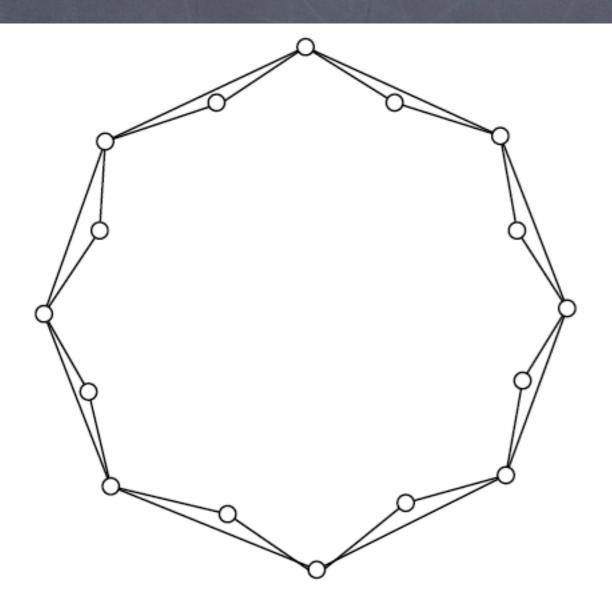
6.86<sup>$$n^2$$</sup> "="  $F_{4n^2-1}$  (Fibonacci Number)

## Open Problem Regular Triangulations of the Lattice

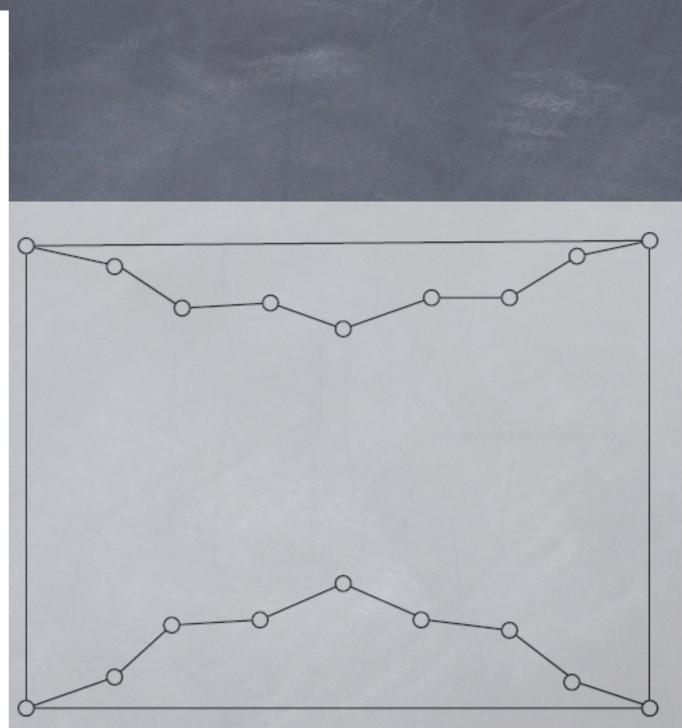
Is the number of regular (i.e. liftable) triangulations of  $L_{n\times n}$  exponentially smaller than  $tr(L_{n\times n})$ ?

 $reg-tr(L_{n\times n}) \leq c^{(n+1)^{2}} tr(L_{n\times n})$  for c<1?[Kaibel,Ziegler]

I. (Specific) Counting 3. Two more Examples



 $O(3.47^n)$  triangulations [Hurtado,Noy'97]



Ω(8.48<sup>n</sup>) triangulations [Aichholzer,Hackl,Krasser Huemer,Hurtado,Vogtenhuber'06]

### Convex Position is not Extremal

with P in general position  $tr(n) := max_{|P|=n} tr(P)$  $tr_{min}(n) := min_{|P|=n} tr(P)$ 

?  $\leq_{n} tr_{min}(n) \leq_{n} 3.47^{n} \approx_{n} 4^{n}$ <  $tr(G_{n}) <$ 8.48<sup>n</sup>  $\leq_{n} tr(n) \leq_{n} ?$  II. Extremal Counting 1. Number of Triangulations

## Upper Bound on tr(n)

An upper bound of  $n^{2(3n-6)} = 2^{O(n \log n)}$  is easy.

Encode a triangulation by listing the at most 3n-6 edges in a sequence of numbers in {1,2,...,n} of length at most 2(3n-6).

## Upper Bound on tr(n)

An upper bound of  $n^{2(3n-6)} = 2^{O(n \log n)}$  is easy.

Late 70's: David Avis raised the question and conjectured a bound of c<sup>n</sup>; (see also related question by Newborn and Moser on crossing-free spanning cycles)

[Ajtai, Chvátal, Newborn, & Szemerédi`82] proved and employed the Crossing Lemma for tr(n) ≤ 10000000000000

# Issue Resolved -Except for the Base Constant

tr(n)	$\leq$	$(10^{13})^{2}$	n	[Ajtai <i>et al.</i> '82]
		$173000^n$		[Smith'89]
		276.8 <sup>n</sup>		[Denny,Sohler'97]
		59 <sup>n</sup>	[Sa	antos,Seidel'03]
		$43^{n}$	[Sł	narir,Welzl'06]

 $tr(n) ≤ 30^n$  [Sharir, Sheffer, Welzl'09]  $tr(n) ≥ 8.48^n$  [Aichholzer et al.'06] II. Extremal Counting 2. Random Triangulations vertices of degree 3

with link to number of triangulations

# Triangular Convex Hull

Fix a set H of vertices of a triangle  $\Delta$ . For point sets  $P \subseteq \Delta$ , let  $P^+ := P \cup H$ .

 $tr^{+}(n) := max_{|P|=n, P \subseteq \Delta} tr(P^{+})$ 

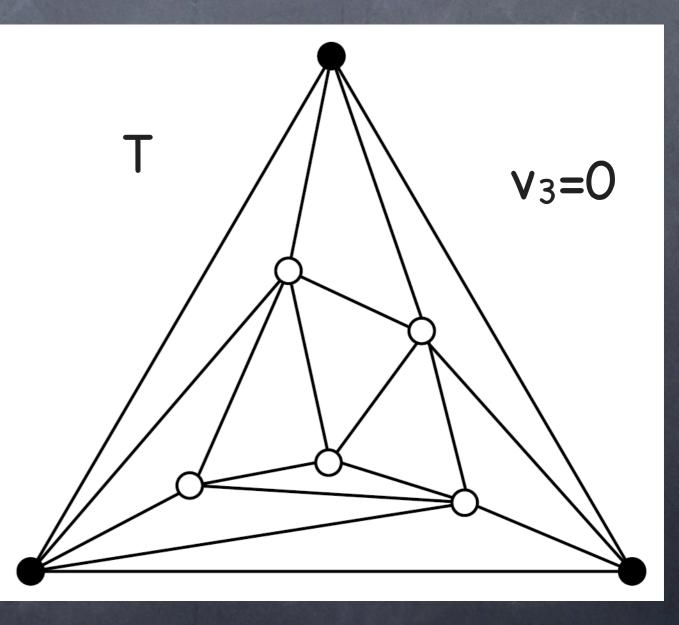
tr(n) ≤ tr<sup>+</sup>(n), since for any set P, let Q be
a scaled translate of P so that Q⊆Δ. Then
tr(P) = tr(Q) ≤ tr(Q<sup>+</sup>).

Degree 3 Vertices v<sub>3</sub> = v<sub>3</sub>(T) := number of inner vertices of degree 3 in triangulation T of P<sup>+</sup>.

**v**<sub>3</sub> ≥ 0

#### $\hat{v}_3 = \hat{v}_3(P) := E[v_3]$

with expectation over uniform distribution of all triangulations of P<sup>+</sup>.



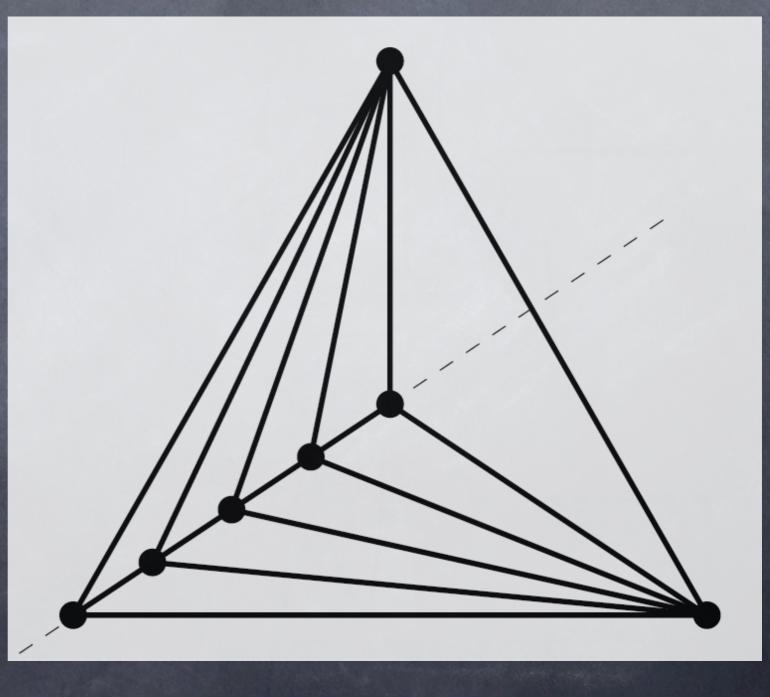
Degree 3 Vertices  $v_3 = v_3(T) :=$  number of inner vertices of degree 3 in triangulation T of P<sup>+</sup>.  $v_3 \geq 0$  $\hat{v}_3/n = Prob[random inner]$ vertex in a random triangulation has degree 3]  $\hat{v}_3 = \hat{v}_3(P) := E[v_3]$ with expectation over uniform distribution of Can we separate this all triangulations of P<sup>+</sup>. probability away from O

(independently from n)?

## No!

#### unique triangulation with one vertex of degree 3

 $\hat{v}_3/n = 1/n \rightarrow 0$ 



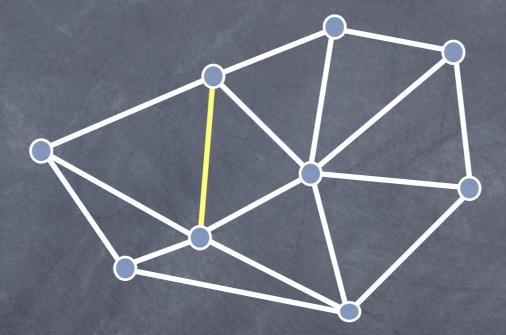


#### Lemma: If P<sup>+</sup> is in general position, then $\hat{v}_3 \ge n/30$

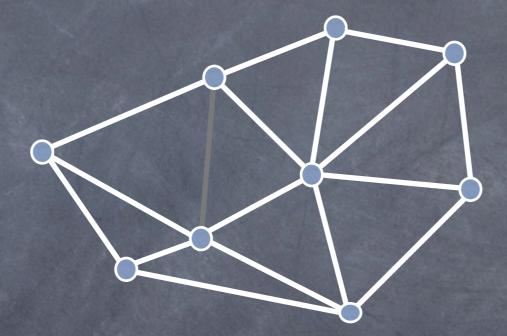
# **Lemma:** If $\hat{v}_3 \ge \delta |P|$ for all P with P<sup>+</sup> in general position, then $tr^+(n) \le (1/\delta)^n$ for all n.

 $\Rightarrow tr(n) \leq 30^{n}$  $\Rightarrow tr(n) \leq 30^{n}$ 

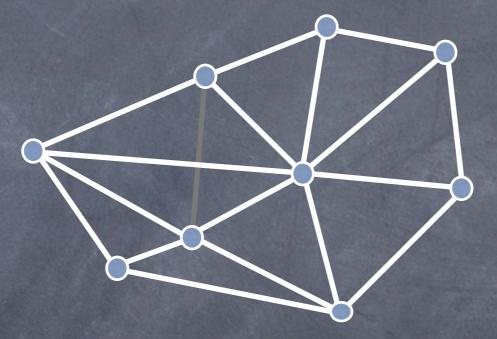
# Edge Flip in Triangulation



# Edge Flip in Triangulation

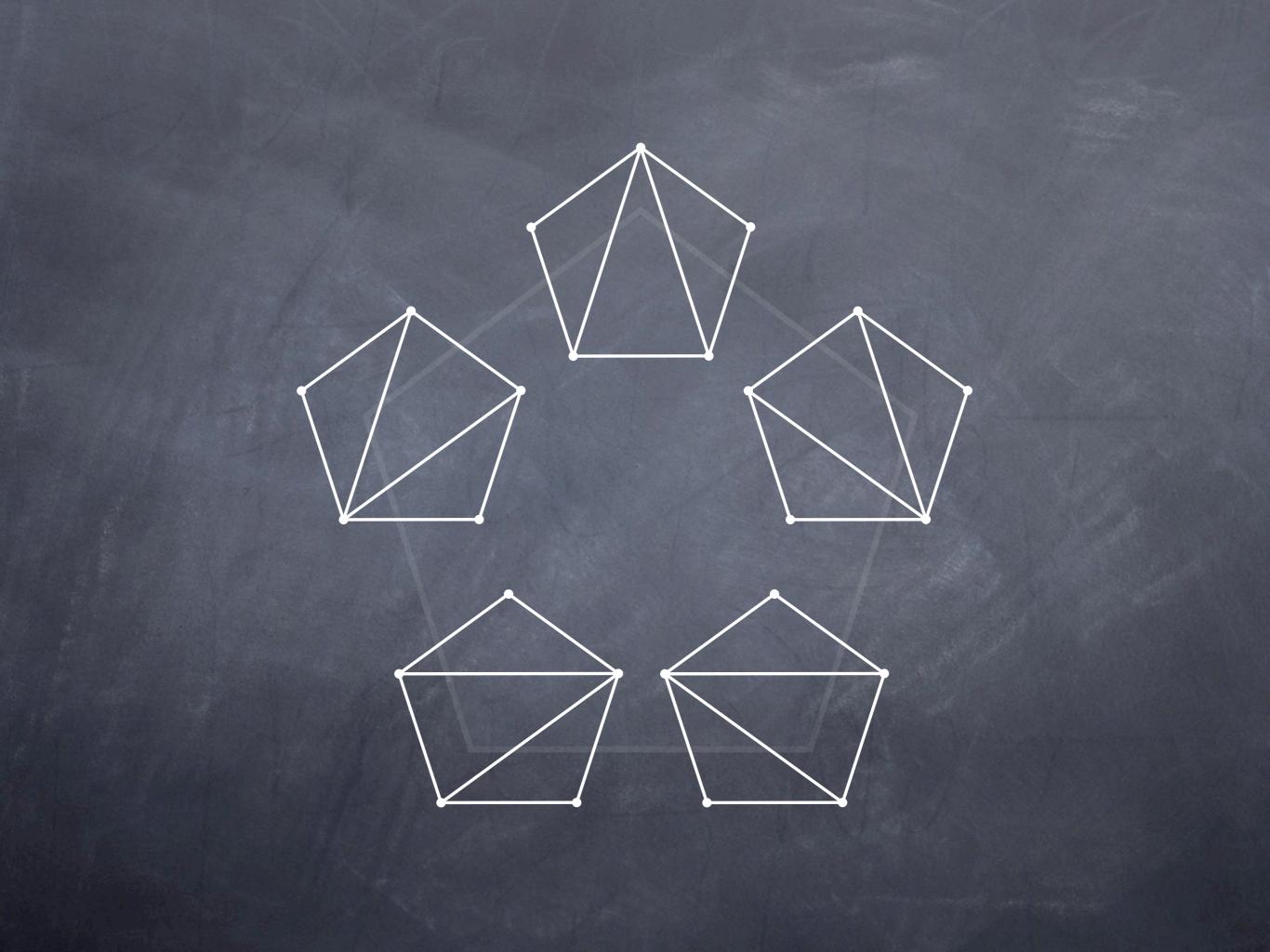


# Edge Flip in Triangulation



#### Set of triangulations is connected via edge flips.

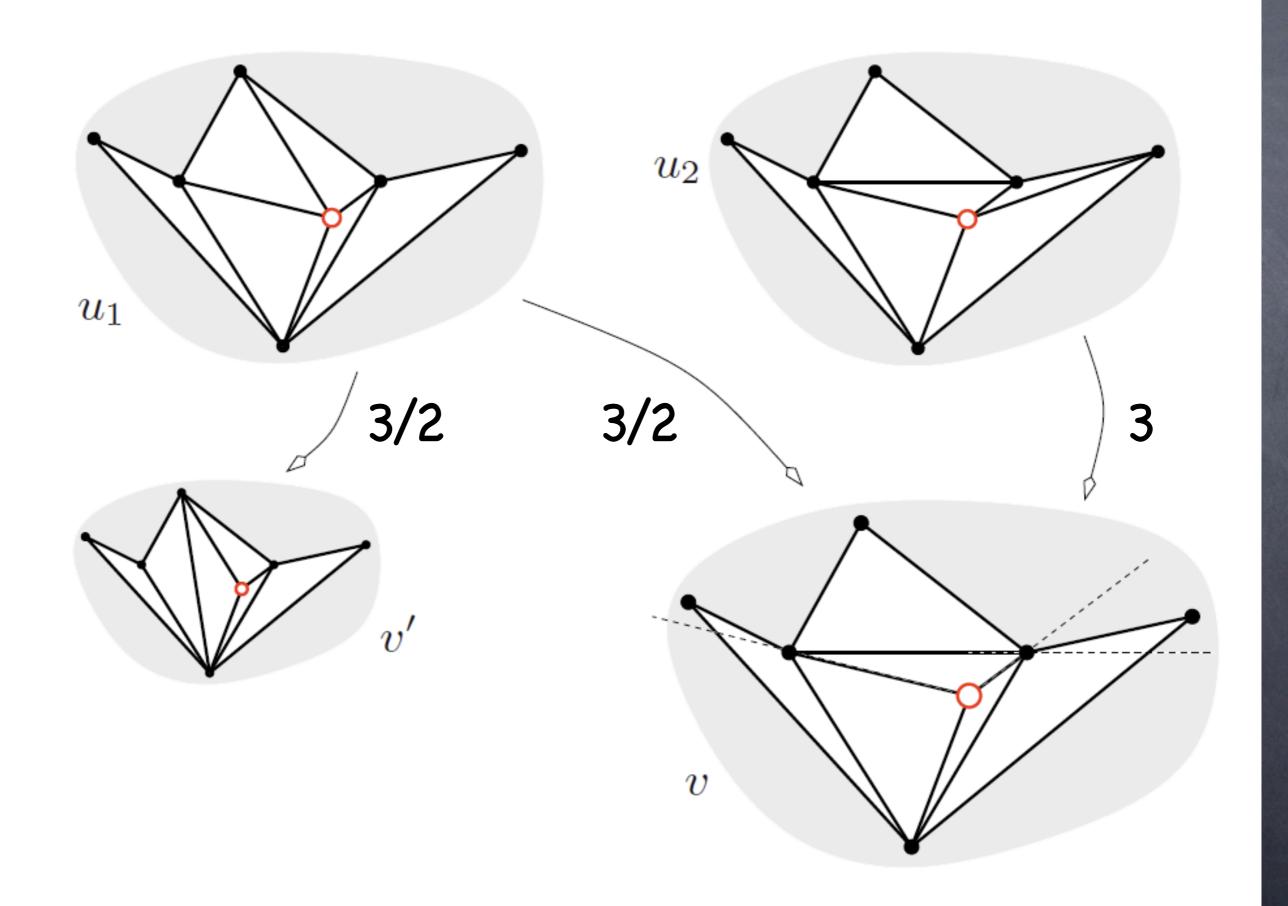
....



#### **Lemma:** If P<sup>+</sup> is in general position, then $\hat{v}_3 \ge n/30$

Proof uses (dis)charging among vertices as in 4color theorem, except that we have to charge here across all triangulations of P<sup>+</sup>.

First, every vertex starts with a charge of 1.
Second, we distribute within each triangulation so that a vertex of degree i has charge ≤(7-i).
Finally, every vertex uniformly distributes its charge to all degree 3 vertices it can be flipped down to.
Show: No degree 3 vertex gets charge exceeding 30.



# **Lemma:** If $\hat{v}_3 \ge \delta |P|$ for all P with P<sup>+</sup> in general position, then $tr^+(n) \le (1/\delta)^n$ for all n.

Proof.

$$\delta n \cdot \operatorname{tr}^{+}(P) \leq \widehat{v}_{3}(P) \cdot \operatorname{tr}^{+}(P) = \sum_{q \in P} \operatorname{tr}^{+}(P \setminus \{q\}) \leq n \cdot \operatorname{tr}^{+}(n-1)$$
$$\Rightarrow \quad \operatorname{tr}^{+}(n) \leq \frac{1}{\delta} \cdot \operatorname{tr}^{+}(n-1)$$

## Open Problem $\hat{v}_3$ versus Number of Triangulations $\delta^* := supremum over all <math>\delta$ such that $\hat{v}_3 \ge \delta |P|$ for all sufficiently large sets P (P<sup>+</sup> in gen. pos.). $c^*$ := infimum over all c such that $tr^+(n) \leq c^n$ for all sufficiently large n. We know that $c^* \leq (1/\delta^*)$ . $c^* = (1/\delta^*)$ ?

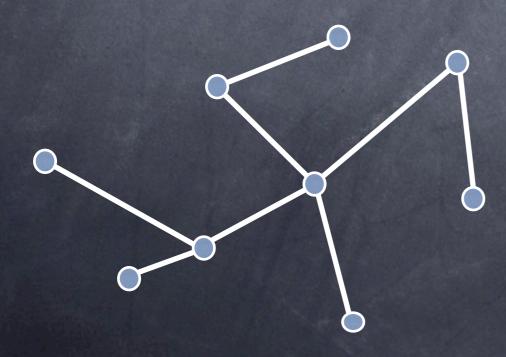
III. Algorithmic Counting

 Counting Triangulations
 by Enumeration

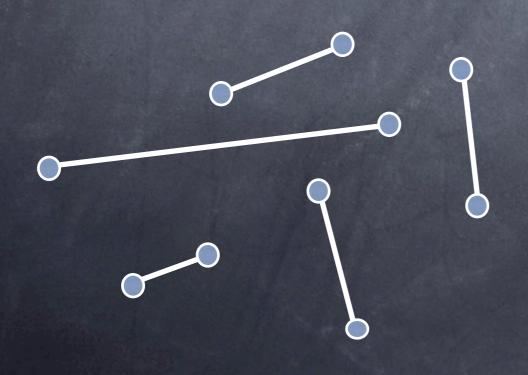
## Counting by Enumeration The number tr(P) of triangulations of an n-element point set P can be computed in time $O(tr(P) \cdot poly(n))$ by enumerating all of them.

[Avis,Fukuda`96]

... same for spanning trees (in time O(st(P) · poly(n)).



#### Open Problem Enumerating Crossing-Free Perfect Matchings Can we enumerate all crossing-free perfect matchings of an n-point set in time O(pm(P) poly(n))?



Is possible for set of all maximal crossingfree matchings.

# Status of Algorithmic Counting

No #P results known.

No polynomial counting results known.

(Except for counting stacked triangulations via dynamic programming.)

# III. Algorithmic Counting 2. All Crossing-Free Graphs with Exponential Speed-up

Need: (i) More extremal counting and (ii) constrained Delaunay triangulations.

#### Exponential Speed-up

For a set P of n points we can compute pg(P) in time O(0.36<sup>n</sup> pg(P)). [Razen,W.`08] [Katoh,Tanigawa`08]

I.e. exponentially faster than the number computed.

# All Crossing-Free Graphs versus Triangulations

obvious estimates:  $tr(P) \leq pg(P) \leq 2^{3n-6} tr(P) \leq 8^n tr(P)$ 

can be improved to:  $2.82^{n} tr(P) \leq pg(P) \leq 7.98^{n} tr(P)$ [Razen,Snoeyink,W.`08] Open Problem All Crossing-Free Graphs versus Triangulations

> Is pg(P)/tr(P) minimized for point sets in convex position?

Note: pg(P)/tr(P) ≥ 2.82<sup>n</sup> is known and pg(G<sub>n</sub>)/tr(G<sub>n</sub>) ≈<sub>n</sub> 2.914...<sup>n</sup>

[Flajolet,Noy`99]

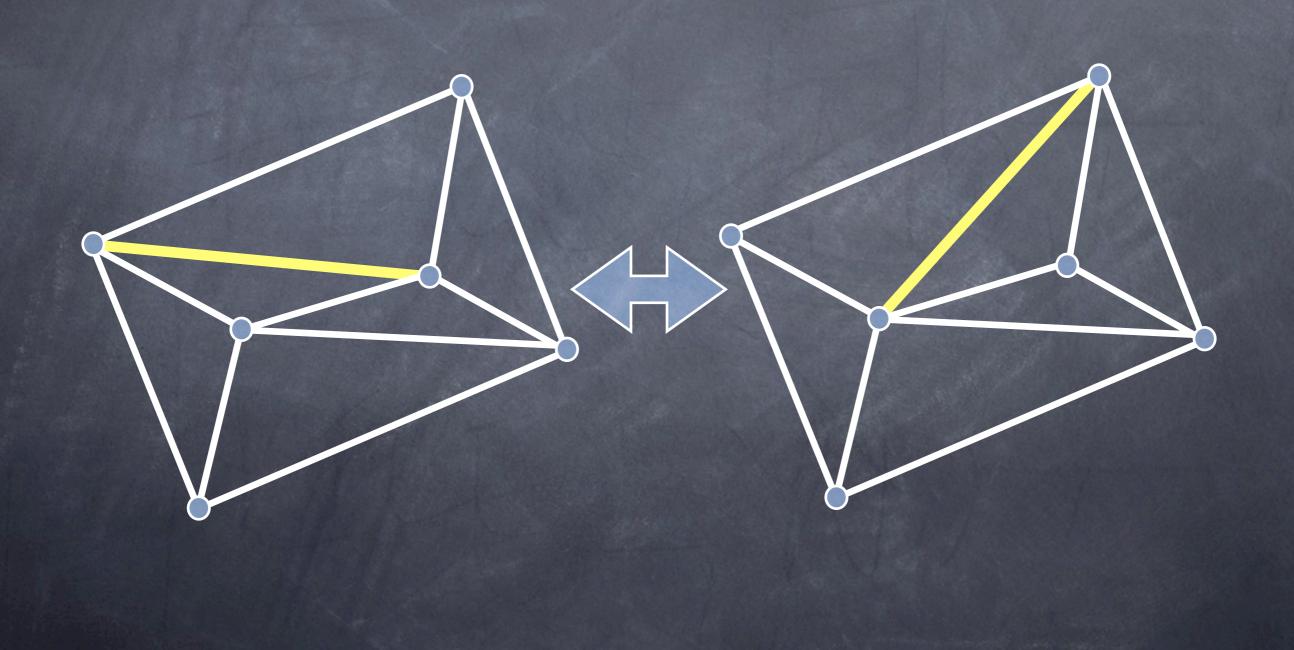
#### Basic Idea

 $2.82^{n} tr(P) \leq pg(P)$  $\Rightarrow tr(P) \leq 0.36^{n} pg(P)$ 

and

pg(P) can be computed in time O(tr(P) poly(n)).

# Back to Flips



# Lawson Flips

#### Applying Lawson Flips ... assume general position Eventually gives the Delaunay Triangulation. If edges G are constrained as unflippable, eventually gives Constrained Delaunay Triangulation CD(G)

CD(G)

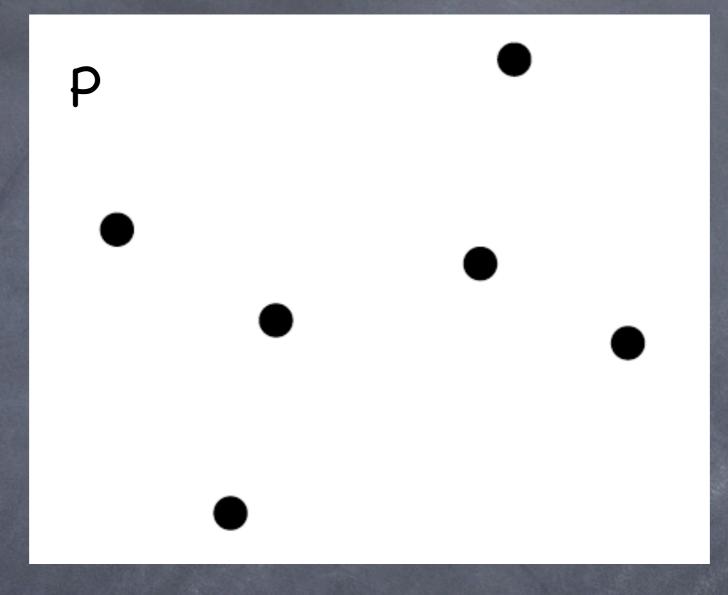
CD(G) does not depend on starting triangulation T⊇G and choice of flips!

# $pg(P) = \sum_{T} 2^{m-|L(T)|}$

Consider the map  $G \mapsto CD(G)$ Then, for triangulation T,  $|CD^{-1}(T)| = 2^{m-|L(T)|}$ 

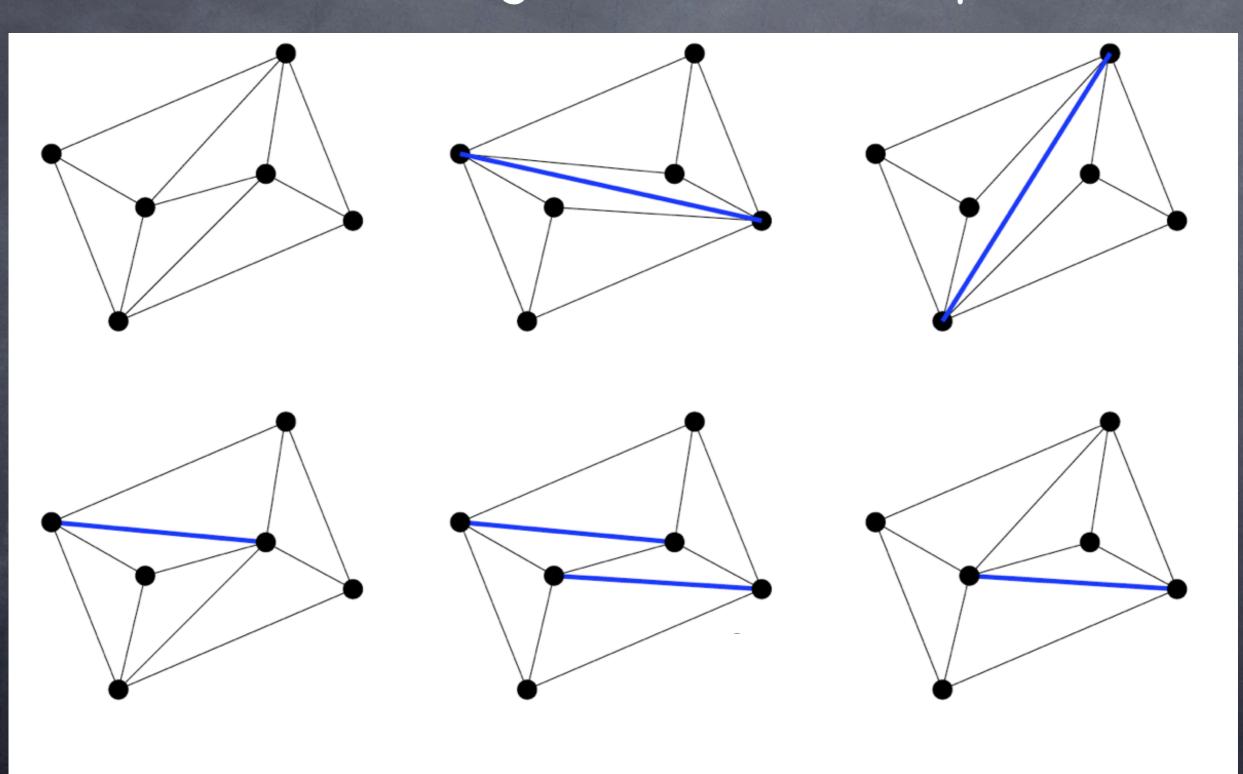
> m ... number of edges L(T) ... candidates for Lawson flips

 $G \mapsto T \text{ iff } L(T) \subseteq G \subseteq T$ 

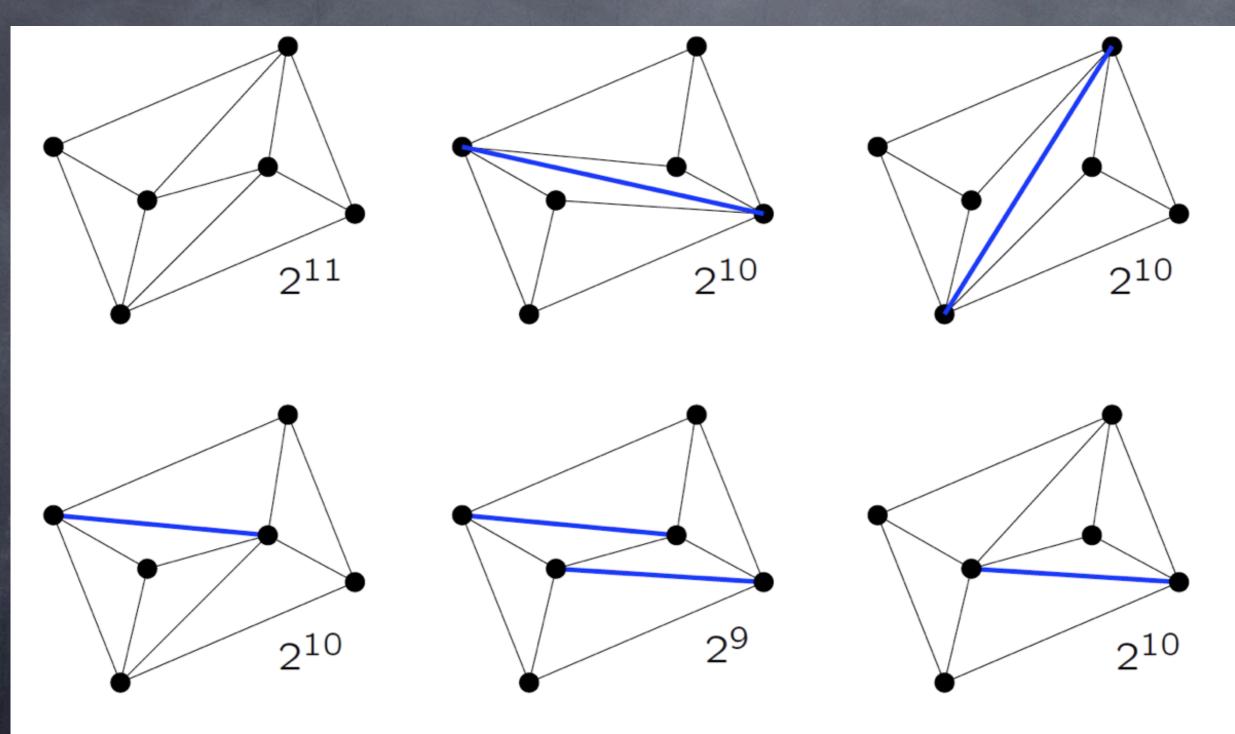


What is the number, pg(P), of all crossing-free graphs on P?

# Consider all triangulations and mark candidate edges for Lawson flips.



#### ... and add up these numbers.



 $pg(P) = 2^{11} + 2^{10} + 2^{10} + 2^{10} + 2^{9} + 2^{10} = 6656$ 

Open Problem Always Many Crossing-Free Spanning Trees? Is there a constant c>1 such that  $st(P) \ge c^n tr(P)$  for every large enough n-point set.

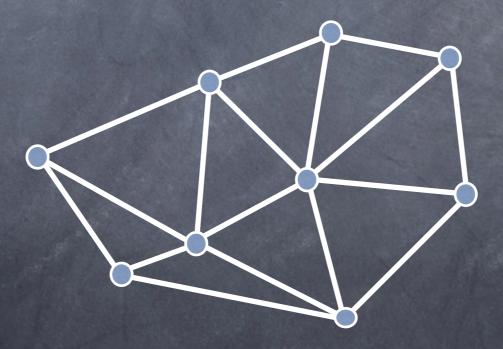
st(P) number of crossing-free spanning trees

(Would imply counting of crossing-free spanning trees with exponential speed-up.)

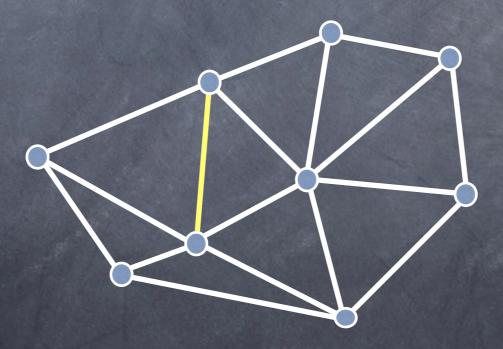
# Open Problem Triangulations with exponential speed-up

Can we compute tr(P) with exponential speed-up, i.e. in time O(c<sup>|P|</sup> tr(P)) for a constant c<1?

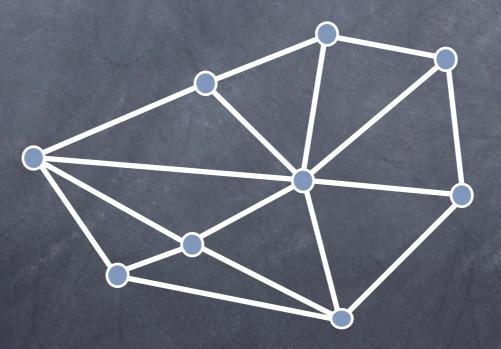
What is the mixing rate of the Flip-Markov Chain on an arbitrary n-point set?



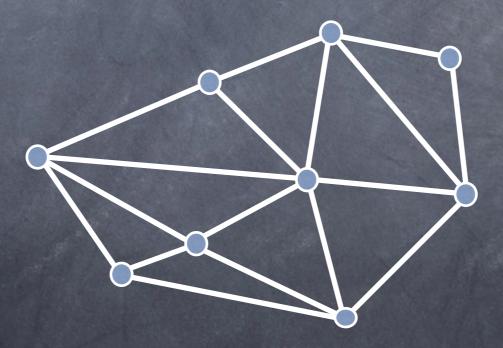
What is the mixing rate of the Flip-Markov Chain on an arbitrary n-point set?



What is the mixing rate of the Flip-Markov Chain on an arbitrary n-point set?



What is the mixing rate of the Flip-Markov Chain on an arbitrary n-point set?



and so on

Open Problem Flip-Markov Chain uses  $\hat{v}_3/n=\Omega(1)$ What is the mixing rate of the Flip-Markov Chain on an arbitrary n-point/set? Polynomial mixing rate would give polynomial approximate counting of triangulations. What is the mixing rate of the Flip-Markov Chain on the  $(n \times n)$ -lattice? (Known to be polynomial for points in convex position.) [Molley, Reed, Steiger `98] [McShine, Tetali `98]