

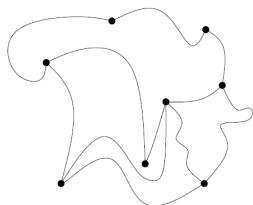
# Planar maps, random walks and the circle packing theorem

Asaf Nachmias  
Tel-Aviv University

Charles River Lectures, September 30th, 2016

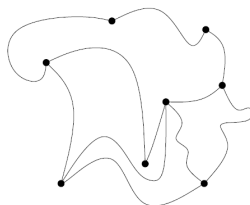
# Basic terminology

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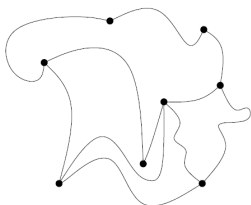
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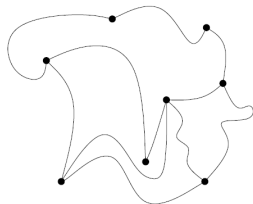
- (a) **Triangulation**: each face has three edges.
- (b) **Quadrangulation**: each face has four edges.
- The **simple random walk** on a graph starts at an arbitrary vertex and in each step moves to a uniformly chosen neighbor.

# Circle packing

Let  $G$  be a finite simple planar graph.

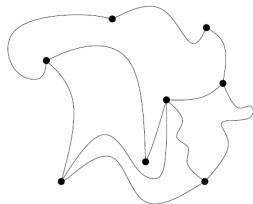
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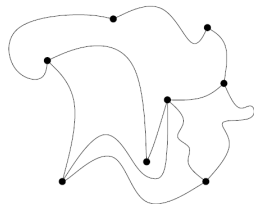
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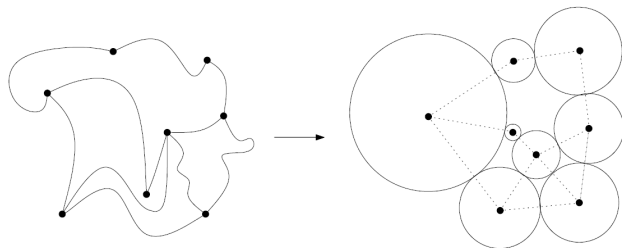
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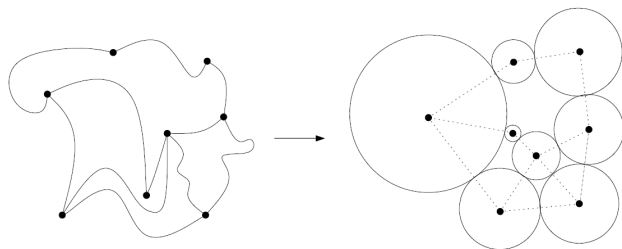
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If  $G$  is a triangulation, then the drawing is unique up to Möbius transformations and reflections.

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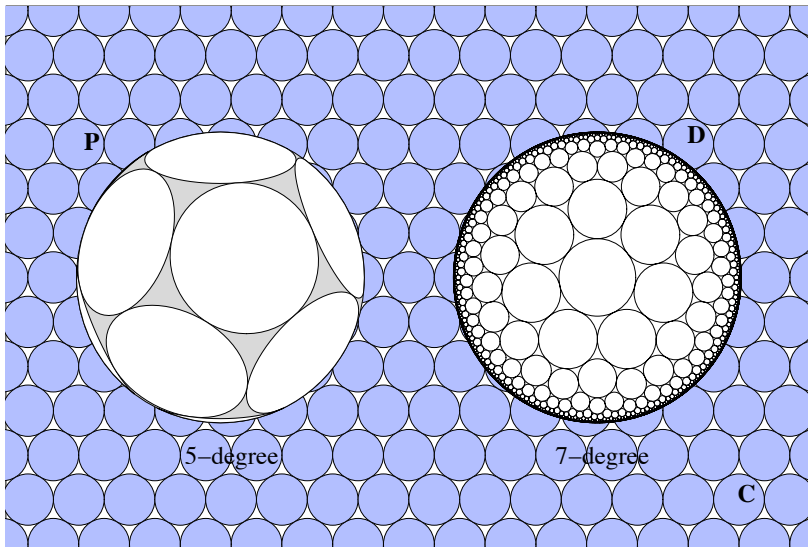
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- The set of accumulation points  $A(P)$  is the boundary of the carrier  $\text{carr}(P)$ .



Picture due to Ken Stephenson.

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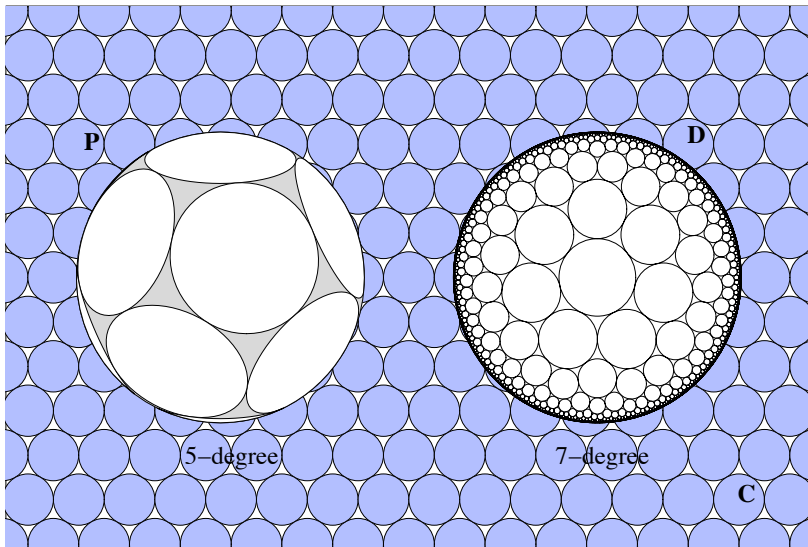
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## Theorem (Schramm's rigidity '91)

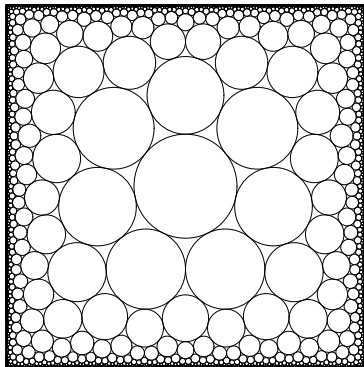
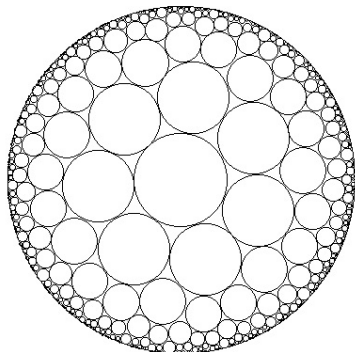
*The above circle packing is unique up to Möbius transformations of the plane or the sphere as appropriate.*



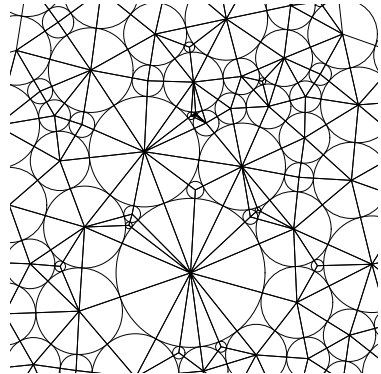
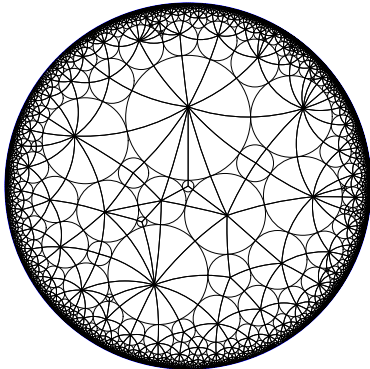


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# 7-regular hyperbolic tessellation



Circle packing also gives us a drawing of the graph with either straight lines or hyperbolic geodesics depending on the type.



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### Theorem (Benjamini-Schramm '96)

*Assume  $G$  is a bounded degree, CP hyperbolic triangulation of the plane circle packed in the unit disc  $\mathbb{D}$ . Then the random walk converges to  $\partial\mathbb{D}$ , the exit measure is non-atomic and has full measure.*

# A dichotomy for bounded degree plane triangulations

If  $G$  is **bounded degrees** triangulation of the plane, then either:

*Random walk on  $G$  is recurrent,  $G$  is CP parabolic and all bounded harmonic functions are constant,*

or

*Random walk on  $G$  is transient,  $G$  is CP hyperbolic and any bounded Borel  $g : \partial\mathbb{D} \rightarrow \mathbf{R}_+$  extends to  $G$ .*

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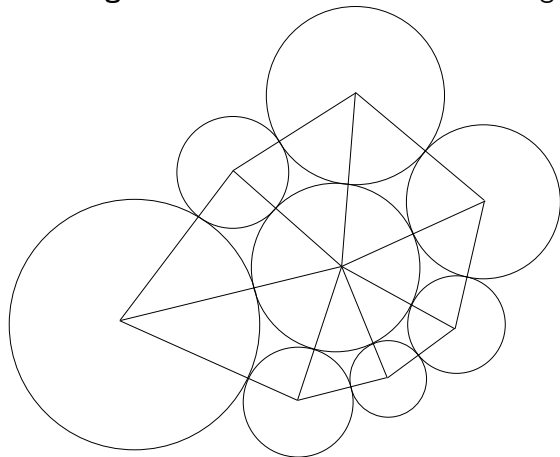
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**Theorem:** There are no other bounded harmonic functions (Angel, Barlow, Gurel-Gurevich, N. '13).

# The ring lemma (Rodin-Sullivan '87)

Consider a circle packing of a bounded degree [triangulation](#).

**The ring lemma:** The ratios of radii of tangent circles is bounded.

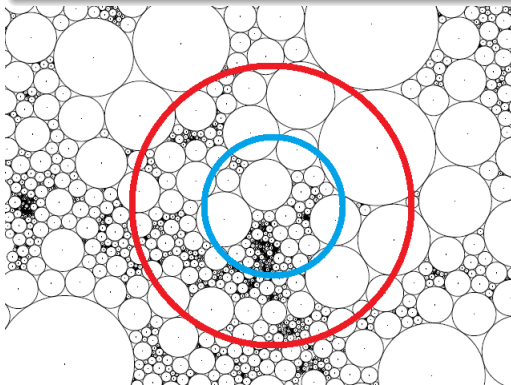


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**Proof sketch:** Recall that the energy of  $f$  is  $\mathcal{E}(f) = \sum_{x \sim y} (f(x) - f(y))^2$  and that  $R_{\text{eff}}^{-1} = \inf \mathcal{E}(f)$ , over all  $f$  which are 0 and 1 on the two sides of the annulus.

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Hence, the sum is bounded. □

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Let  $G$  be a triangulation. Construct a Riemannian surface  $\mathcal{M}(G)$  by gluing Euclidean equilateral triangles of edge length 1 according to the combinatorics of the graph. The surface is flat everywhere except the vertices, on which the chart is  $z \mapsto z^{6/\deg}$ . The surface is equipped with the natural shortest (continuous) path metric.

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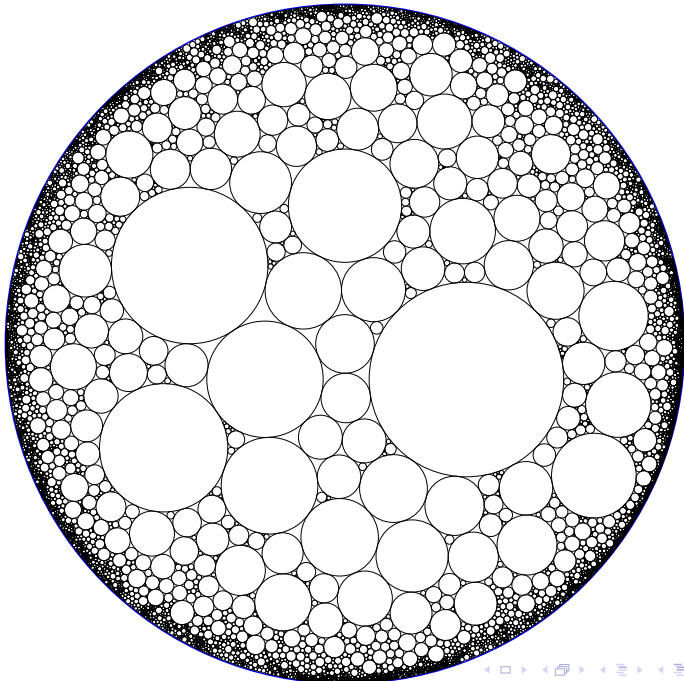
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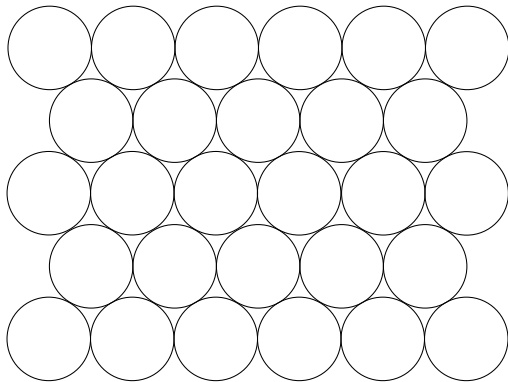
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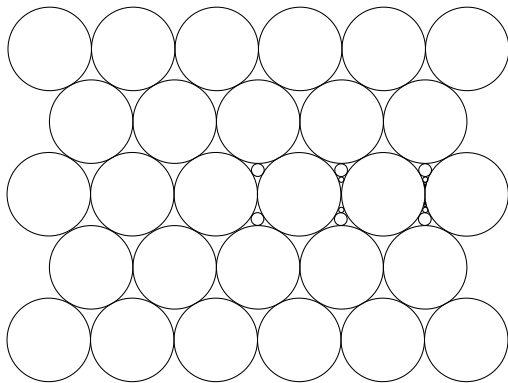
**Stronger result:** A bounded degree circle packing  $P$  is recurrent iff its set of accumulation points is missed by planar Brownian motion almost surely (Gurel-Gurevich, N., Souto 2014).



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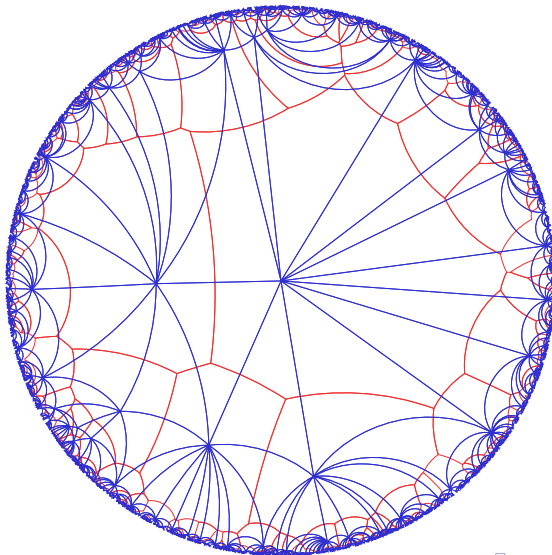
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And, in the hyperbolic case,

- Question 3: Does the walker converge to a point in the boundary of the disc? Does the law of the limit have full support and no atoms almost surely?
- Question 4: Is the unit circle a realisation of the Poisson boundary?

# Example 1: Poisson-Voronoi triangulation



# Random Triangulations of the Sphere

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The  $G_n$  Benjamini-Schramm converge to a random rooted graph  $(G, \rho)$  if for each fixed  $r$ , the balls of radius  $r$  converge in distribution:

$$B_r(G_n, \rho_n) \xrightarrow{d} B_r(G, \rho)$$

# Examples of Benjamini-Schramm convergence

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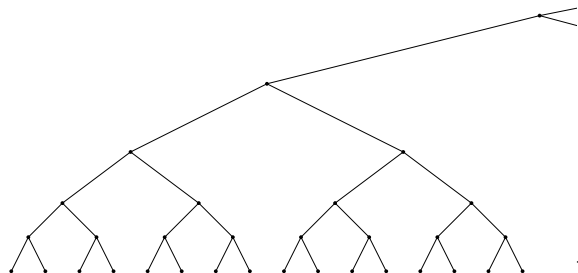
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the **canopy tree**.

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### Theorem (Gurel-Gurevich, N. 2013)

*The UIPT is almost surely recurrent.*

## Example 2: hyperbolic triangulations with Markov property

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Are there any other triangulations with this property?

**Theorem (Angel and Ray '13, Curien '13)**

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## Example 2: hyperbolic triangulations with Markov property

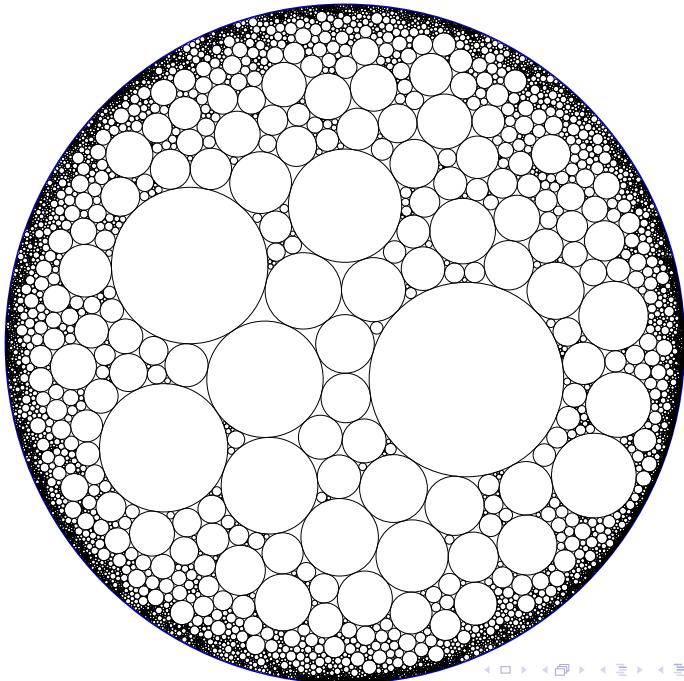
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Conjecturally, the hyperbolic triangulations are Benjamini-Schramm limits of uniform triangulations with  $n$  vertices of surfaces of genus  $cn$ .



# Unimodular random triangulations

A random rooted graph  $(G, \rho)$  is called **unimodular** if the *mass transport principle* holds: for any *automorphism invariant*  $f : \mathcal{G}^{**} \rightarrow \mathbb{R}_+$ ,

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## Theorem (Angel, Hutchcroft, N., Ray 2014)

Let  $G$  be a unimodular plane triangulation. Then either

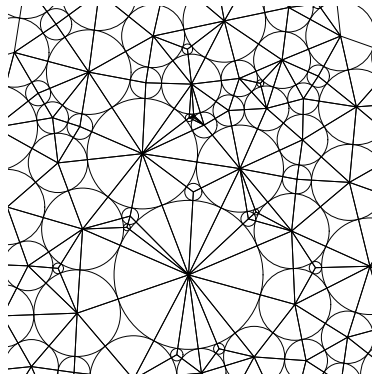
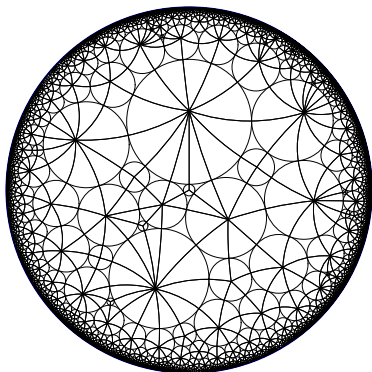
- $G$  is CP parabolic and  $\mathbf{E} \deg(\rho) = 6$ , or
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## Theorem (Benjamini, Schramm 1996)

*Any distributional limit of finite planar triangulations is CP-parabolic. Hence, if the degrees are bounded, the resulting graph is almost surely recurrent for the simple random walk.*

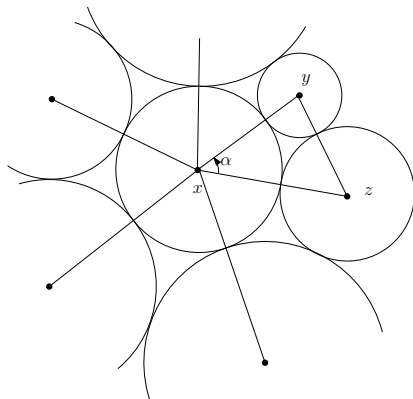
Our proof avoids the use of a powerful, yet rather technical, lemma of Benjamini-Schramm known as the “magical lemma”.

Circle packing also gives us a drawing of the graph with either straight lines or hyperbolic geodesics depending on the type



# Proof: CP type and average degree (parabolic case)

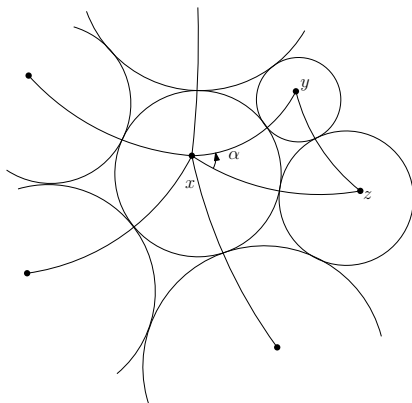
For each corner, send  $\alpha$  from  $x$  to each of  $x, y, z$ .



Mass out is  $6\pi$ . Mass in is  $\pi \deg(x)$ .

# Proof: CP type and average degree (hyperbolic case)

For each corner, send  $\alpha$  from  $x$  to each of  $x, y, z$ .



Mass out is  $6\pi$ . Mass in is less than  $\pi \deg(x)$ .

# Non-amenability

- Recall that the (edge) **Cheeger constant** of an infinite graph  $G$  is defined to be

$$\iota_E(G) = \inf \left\{ \frac{|\partial_E W|}{|W|} : W \subset V(G) \text{ finite} \right\},$$

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- Are unimodular CP hyperbolic triangulations non-amenable? No, the condition is too strong.

# Invariant non-amenability (Aldous-Lyons '07)

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- A unimodular graph  $(G, \rho)$  is said to be **invariantly non-amenable** iff  $\iota^{\text{inv}}(G) > 0$ .
- Easy fact:  $\iota^{\text{inv}}(G) > 0 \iff \mathbf{E} \deg(\rho) - \alpha(G) > 0$  where

$$\alpha(G) = \sup \left\{ \mathbf{E}[\deg_\omega(\rho)] : \omega \text{ a finite percolation} \right\}.$$

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- Critical Galton-Watson tree conditioned to survive is invariantly amenable.
- Fact (Aldous-Lyons '07): If  $(G, \rho)$  is unimodular and is a.s. recurrent, then it is invariantly amenable.

# CP Hyperbolic triangulations

By Euler's formula the average degree of any *finite* planar triangulation is at most 6. Hence,

## Theorem (Angel, Hutchcroft, N., Ray 2014)

Let  $G$  be a unimodular plane triangulation. Then either

- $G$  is CP parabolic and  $\mathbf{Edeg}(\rho) = 6$  *and is invariantly amenable*, or
- $G$  is CP hyperbolic and  $\mathbf{Edeg}(\rho) > 6$  *and is invariantly non-amenable*.

## Theorem (Angel, Hutchcroft, N., Ray '14)

Let  $(G, \rho)$  be a CP hyperbolic unimodular random planar triangulation with  $\mathbb{E}[\deg^2(\rho)] < \infty$  and let  $\mathcal{C}$  be a circle packing of  $G$  in the unit disc. The following hold conditional on  $(G, \rho)$  almost surely:

- 1 The random walk almost surely has  $X_n \rightarrow X_\infty \in \partial\mathbb{D}$
- 2 The law of  $X_\infty$  has full support and no atoms.
- 3  $\partial\mathbb{D}$  is a realisation of the Poisson-Furstenberg boundary of  $G$ .

# Proof of convergence: $X_n \rightarrow X_\infty \in \partial\mathbb{D}$

- Assume  $G$  is **really** non-amenable and has degrees bounded by  $M$ . Then for some  $a < 1$  and any  $v$

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- When  $G$  is only invariantly non-amenable, perform the same argument on the “dense” non-amenable subgraph and argue that in the times the random walker is not in this subgraph things cannot go very badly.

**Thank you!**

Image by Maxim Krikun

