

# Random walks on weakly hyperbolic groups

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Random and Arithmetic Structures in Topology  
MSRI - Fall 2020

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*Random walks on weakly hyperbolic groups*

*Random walks, WPD actions, and the Cremona group*

## Introduction to random walks

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**Answer.** It depends on the topography (geometry) of the city.

# Recurrent random walks

## **Example 1: Squareville**

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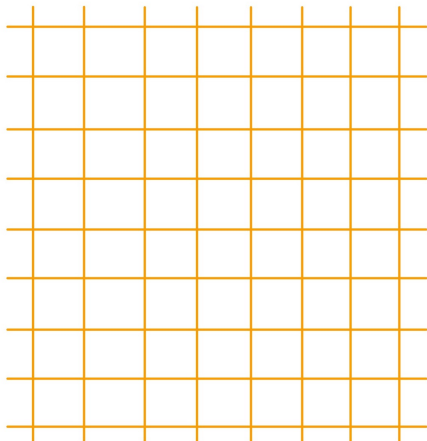
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What is the probability of coming back to where you started?

# Recurrence

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**Exercise.** Prove the Lemma.

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$\therefore$  our RW is **recurrent**.

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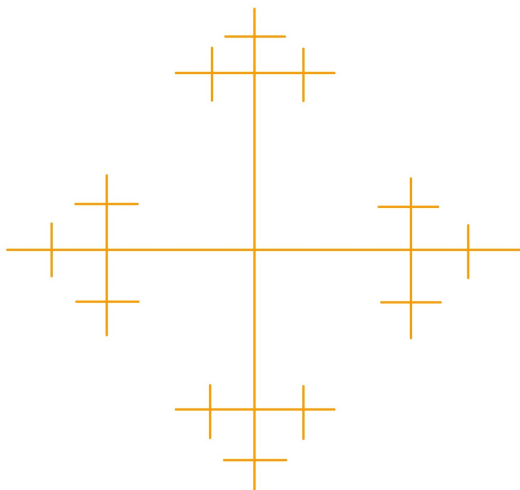
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**Exercise.** Prove Polya's theorem for  $d = 3$ . Moreover, for the simple random walk on  $\mathbb{Z}^d$ , show that  $p^{2n}(0,0) \approx n^{-\frac{d}{2}}$ .

## Transient random walks

### Example 2: Tree City

In Tree City, the map has the shape of a 4-valent tree.



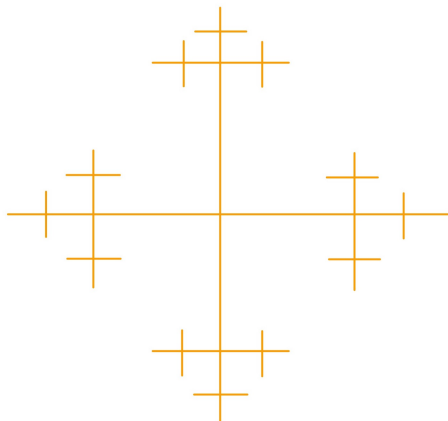
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(do we know  $\lim_{n \rightarrow \infty} \frac{d_n}{n}$  exist?)

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$$\rho(t) : x \mapsto x + t.$$

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Moreover, we define the **word metric** or **word distance** between  $g, h \in G$  as

$$d(g, h) := \|g^{-1}h\|.$$



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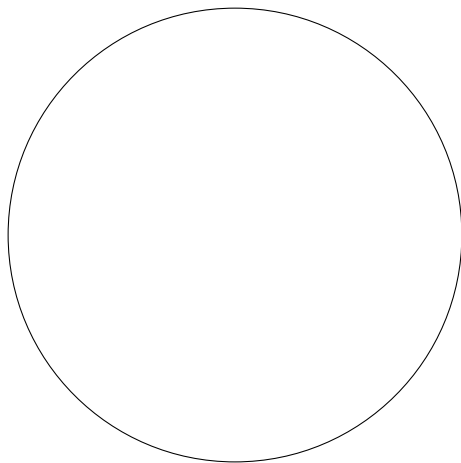
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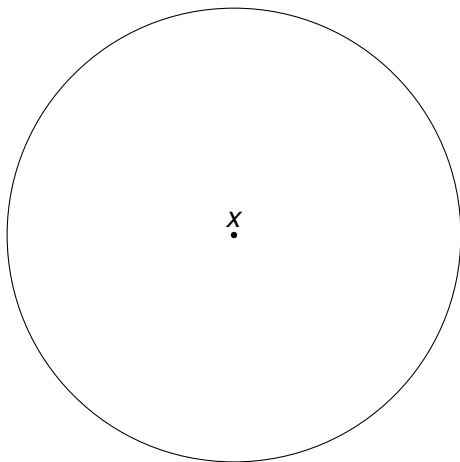
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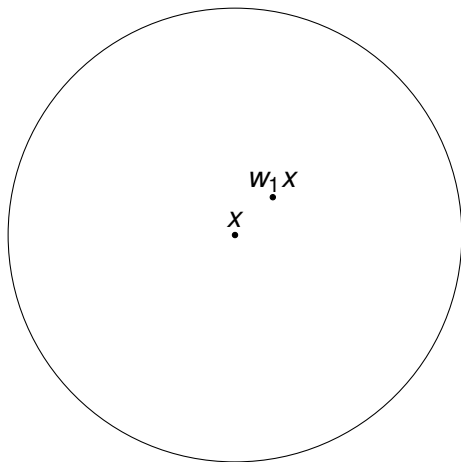
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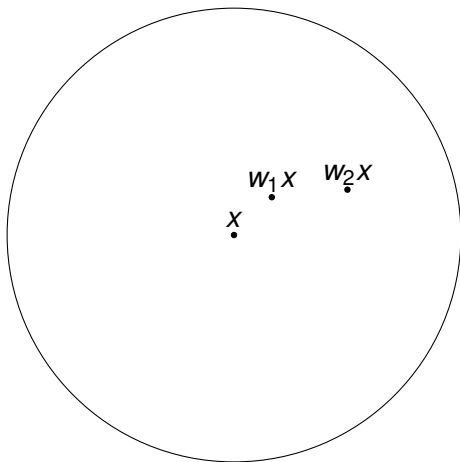
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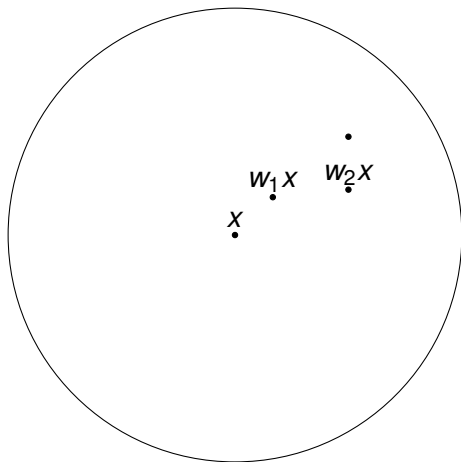
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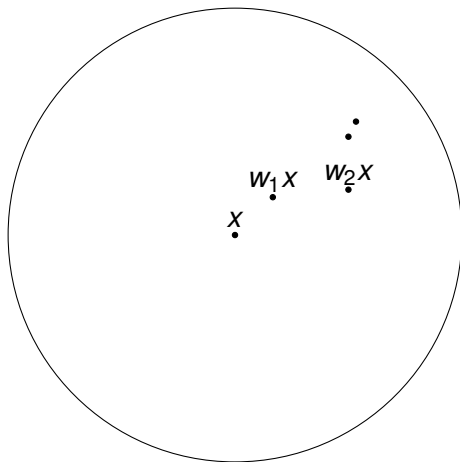


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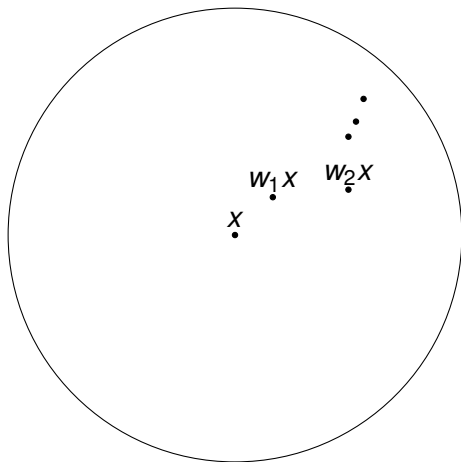
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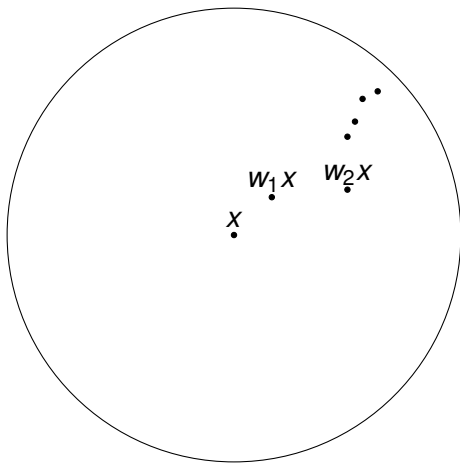
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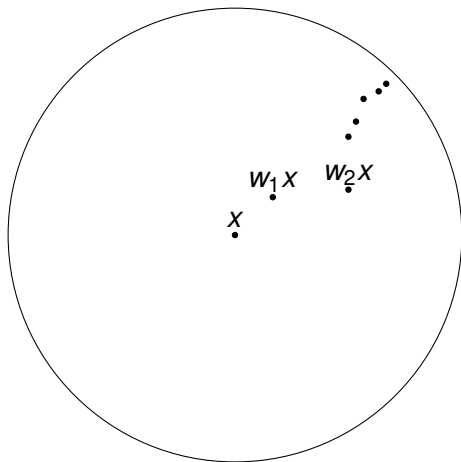
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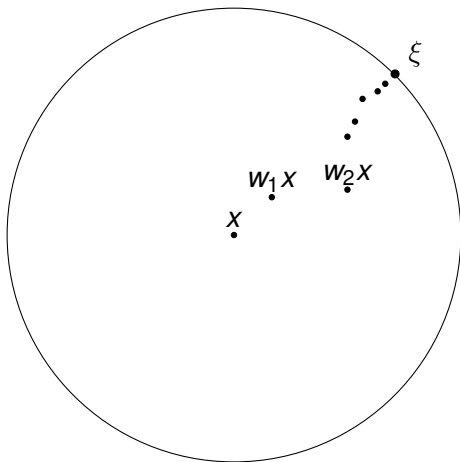
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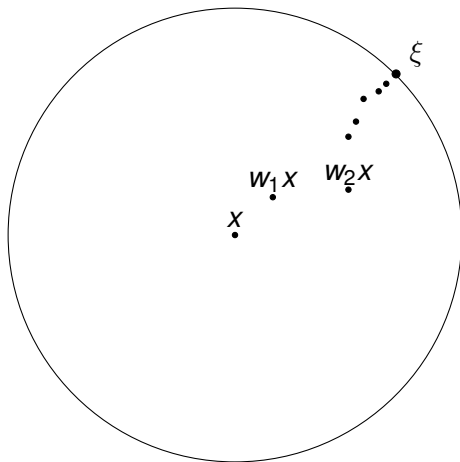
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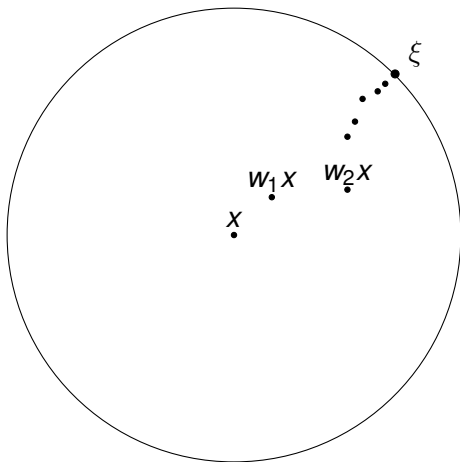
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## Example: the hyperbolic plane

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This RW converges a.s. to the boundary (Furstenberg).

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A measure  $\mu$  on  $G$  has **finite first moment** on  $X$  if for some (equivalently, any)  $x \in X$

$$\int_G d(x, gx) d\mu(g) < +\infty.$$

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*If  $\mu$  has finite first moment, then there exists a constant  $L \in \mathbb{R}$  such that for a.e. sample path*

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6. Is  $(\partial X, \nu)$  a model for the **Poisson boundary** of  $(G, \mu)$ ? That is, do you have a **representation formula** for bounded harmonic functions?

## Hyperbolic metric spaces

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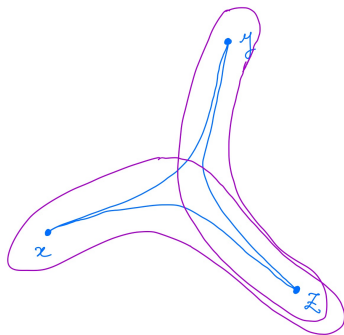
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Recall a space is **proper** if metric balls  $\{z \in X : d(x, z) \leq R\}$  are compact.

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A group is **weakly hyperbolic** if it admits a non-elementary action on a (possibly non-proper) hyperbolic metric space.

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