

# Equivalence relations and random graphs: an introduction to **graphical dynamics**

Vadim A. Kaimanovich

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April 19, 2012

Warwick

*The foundations of these operations are evident enough, but I cannot proceed with the explanation of it now. I have preferred to conceal it thus:*

6accdae13eff7i319n4o4qrr4s8t12vx

▸ Second letter of Newton to Leibniz (1676)

*Data aequatione quotcunque fluentes quantitae involvente fluxiones invenire et vice versa*

Given an equation involving any number of fluent quantities, to find the fluxions, and vice versa

**It is useful to solve differential equations!**

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# It is useful to consider invariant measures!

► WHERE?

## Classical examples

- smooth dynamics;
- ergodic theory dynamics;
- symbolic dynamics.

graphical dynamics?!

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A **graph**  $\Gamma$  is determined by its set of **vertices** (*nodes*)  $V$  and its set of **edges** (*links*)  $E$  connected by an incidence relation (further “decoration” is possible!).

Structured “big” set  $\implies$  local structure  $\implies$  graph structure

How can one understand a collection of (large) finite objects?

finite objects  $\rightarrow$  infinite objects  $\rightarrow$  invariant measures

finite words  $\rightarrow$  infinite words  $A^{\mathbb{Z}}$   $\rightarrow$  ✓ information theory

finite graphs  $\rightarrow$  infinite graphs  $\mathcal{G}$   $\rightarrow$  ?

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# Holonomy invariant measures on foliations ▶ Plante 1975

## Measured equivalence relations (Feldman–Moore 1977)

$(X, \mu)$  — a Lebesgue probability space

$R \subset X \times X$  — a **Borel equivalence relation with at most countable classes** (examples: orbit equivalence relations of group actions, traces on transversals in foliations, etc.)

A **partial transformation of  $R$**  — a measurable bijection  $\varphi : A \rightarrow B$  with graph  $\varphi \subset R$

### Definition

The measure  $\mu$  is  **$R$ -invariant** if  $\varphi\mu_A = \mu_B$  for any partial transformation of  $R$ .

One can also talk about **quasi-invariant measures** and the associated **Radon–Nikodym cocycle**

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## Definition (Feldman–Moore 1977)

The (left) **counting measure** is

$$d\#_{\mu}(x, y) = d\mu(x)d\#_x(y),$$

where  $\#_x$  is the counting measure on the fiber  $p^{-1}(x)$  of the projection  $p : R \rightarrow X$  (i.e., on the equivalence class of  $x$ ).

The **involution**  $[(x, y) \mapsto (y, x)]$  of  $\#_{\mu}$  is the **right counting measure**  $\#^{\mu}$ , and  $\mu$  is  $R$ -quasi-invariant  $\iff \#_{\mu} \sim \#^{\mu}$

## Definition (Feldman–Moore 1977)

$$\mathcal{D}(x, y) = \frac{d\#^{\mu}}{d\#_{\mu}}(x, y) = \frac{d\mu(y)}{d\mu(x)}$$

is the (multiplicative) Radon–Nikodym cocycle.

$\mu$  is invariant  $\iff \mathcal{D} \equiv 1$

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$K \subset R$  — a **leafwise graph structure** on an equivalence relation  $R$ ;  $(X, \mu, R, K)$  — a **graphed equivalence relation**.

A discrete analogue of Riemannian foliations. Further “decoration” is possible! (edge length, labelling, colouring etc.). One can consider structures of higher dimensional **leafwise abstract simplicial complexes**.

Assume that

### Observation

A measure  $\mu$  is  $R$ -invariant  $\iff$  the restriction  $\#_{\mu}|_K$  is involution invariant.

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## Definition

The **simple random walk** on a (locally finite) graph  $\Gamma$  is the Markov chain with the transition probabilities

$$p(x, y) = \begin{cases} 1/\deg x, & x \sim y; \\ 0, & \text{otherwise.} \end{cases}$$

In the same way one defines the **simple random walk along classes of a graphed equivalence relation**  $(X, \mu, R, K)$ , cf. leafwise Brownian motion on foliations (Garnett 1983).

## Theorem (K 1988, 1998)

*A measure  $\mu$  on a graphed equivalence relation  $(X, m, R, K)$  is  $R$ -invariant  $\iff$  the measure  $m = \deg \cdot \mu$  is **stationary and reversible** with respect to the SRW on  $X$ .*

**Idea of proof:** Reversibility  $\equiv$  involution invariance of the joint distribution of  $(x_0, x_1) \equiv$  involution invariance of  $\#_{\mu|K}$ .

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The **simple random walk** on a (locally finite) graph  $\Gamma$  is the Markov chain with the transition probabilities

$$p(x, y) = \begin{cases} 1/\deg x, & x \sim y; \\ 0, & \text{otherwise.} \end{cases}$$

In the same way one defines the **simple random walk along classes of a graphed equivalence relation**  $(X, \mu, R, K)$ , cf. leafwise Brownian motion on foliations (Garnett 1983).

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For continuous group actions the space of invariant measures is weak\* closed  $\implies$  approximation by measures equidistributed on finite orbits (periodic points).

## Definition (K)

A graphed equivalence relation  $(X, R, K)$  on a topological state space  $X$  is **continuous** if the map  $x \mapsto \pi_x$  is continuous (with respect to the weak\* topology on  $M(X)$ ).

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An *invariant measure* need **not** exist! Compactness of the state space implies existence of a *stationary* one (cf. Garnett's **harmonic measures** for foliations).

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$$\pi : x \mapsto ([x]_K, x)$$

What can one say about the arising measures  $\pi(\mu)$ ?

### Definition

$\mathcal{G} = \{(\Gamma, v) : v \text{ is a vertex of } \Gamma\}$  – the space of (isomorphism classes) of locally finite **pointed (rooted)** infinite graphs.

$$\mathcal{G} = \varprojlim \mathcal{G}_r \text{ (pointed finite graphs of radius } \leq r)$$

$\mathcal{G}$  is compact if vertex degrees are uniformly bounded

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$\mathcal{G}$  has natural “**root moving**” **equivalence relation** and the associated **graph structure** (K 1998):

$$\mathcal{R} = \{(\Gamma, v), (\Gamma', v') : \Gamma \cong \Gamma'\}$$
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The equivalence class of a graph  $\Gamma$  is the quotient

$$[\Gamma] = \Gamma / \text{Iso}(\Gamma)$$

$$\begin{aligned} \Gamma \text{ is vertex transitive} &\iff [\Gamma] = \{\cdot\} \\ \Gamma \text{ is quasi-transitive} &\iff [\Gamma] \text{ is finite} \\ \Gamma \text{ is rigid} &\iff [\Gamma] \cong \Gamma \end{aligned}$$

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*If a.e. graph in a graphed equivalence relation  $(X, \mu, R, K)$  with  $R$ -invariant measure  $\mu$  is rigid, then the image measure  $\pi(\mu)$  on  $\mathcal{G}$  is  $\mathcal{R}$ -invariant.*

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Replace **invariance** with **unimodularity**!

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C'est une chose trop grave pour la confier à des militaires!



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(Dr. Strangelove or: How I Learned to Stop Worrying  
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# Do not leave it to probabilists!

# Thank you!

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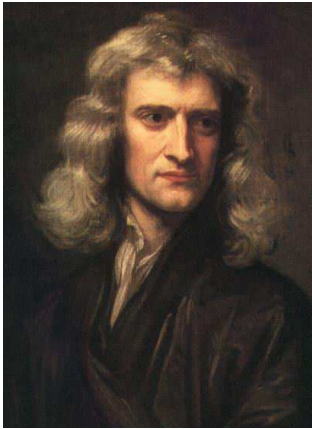
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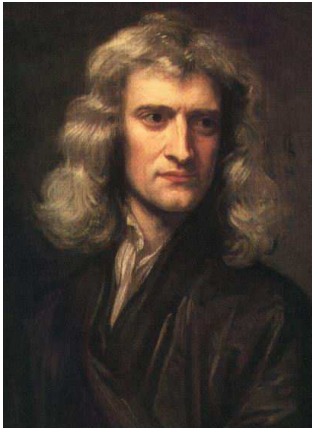
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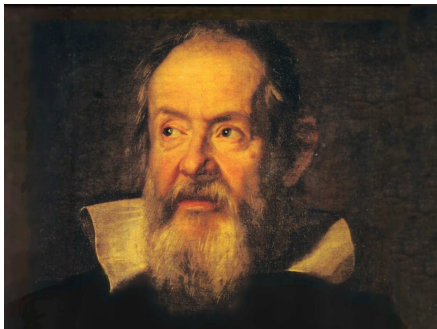
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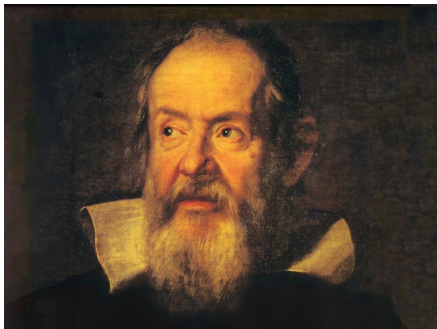
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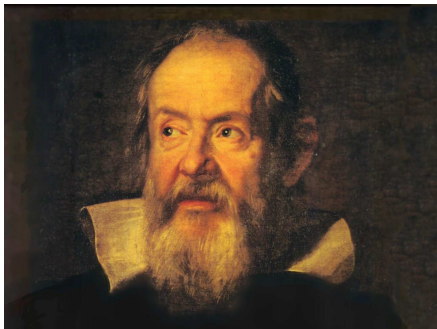
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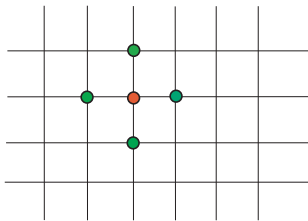
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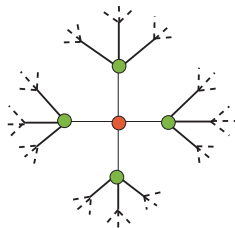


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Euclidean lattice ( $\mathbb{Z}^2$ )



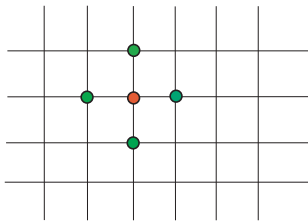
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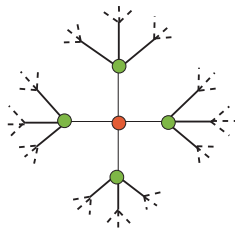
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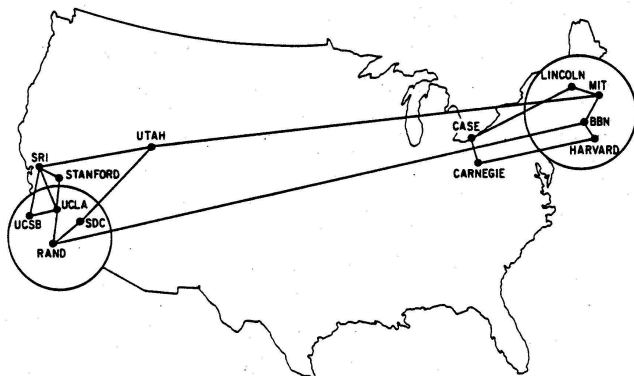
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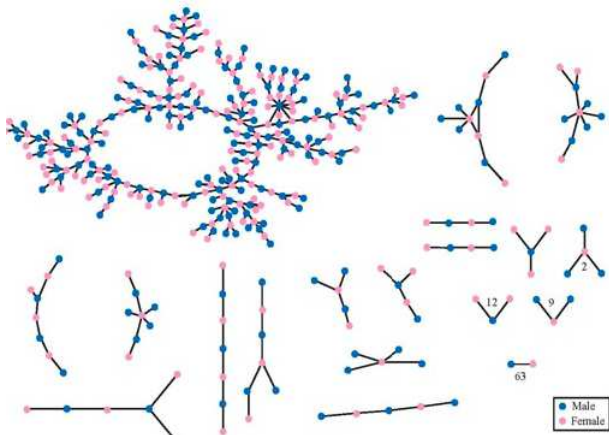
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Arpanet in 1970

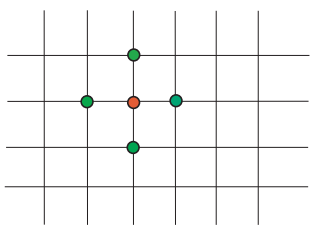


Dating in a high school

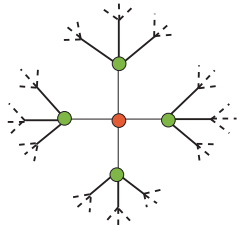




“Roman” encoding ( $1 \longleftrightarrow \text{I}$ ,  $2 \longleftrightarrow \text{II}$ ,  $3 \longleftrightarrow \text{III}$ )



Euclidean lattice ( $\mathbb{Z}^2$ )



Bethe lattice (*free group*  $\mathcal{F}_2$ )

$G$  — group,  $K$  — (symmetric) generating set

Cayley( $G, K$ ) := vertices  $V = G$ ,

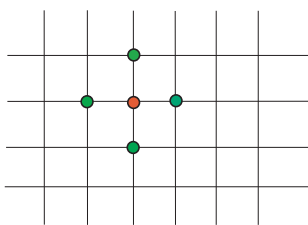
edges  $E = \{(g, kg) : g \in G, k \in K\}$

Edges are labelled!

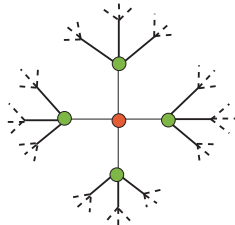
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Euclidean lattice ( $\mathbb{Z}^2$ )



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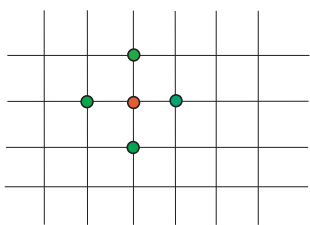
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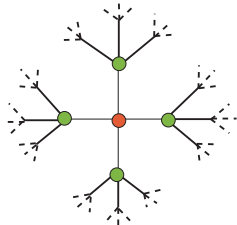
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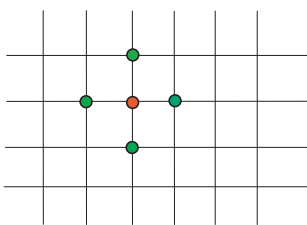
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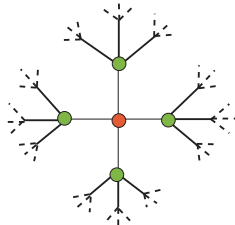
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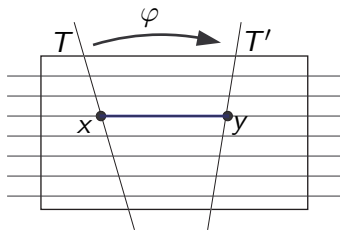
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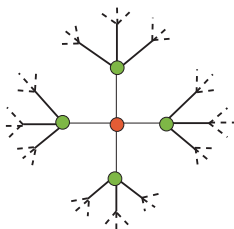
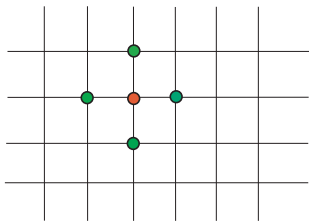
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Holonomy invariant measures on foliations



random fields  
on vertices

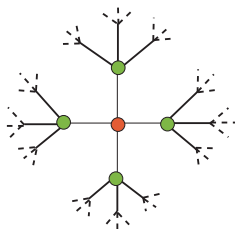
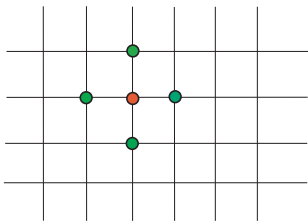
vert.eps

random fields  
on edges

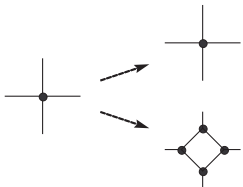
edge.eps

extreme case:  
site percolation

extreme case:  
bond percolation



random fields  
on vertices



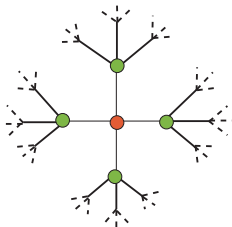
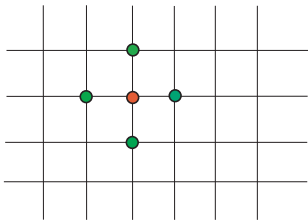
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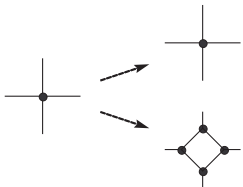


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For an action  $G : X \curvearrowright$

$$X \ni x \mapsto \text{Stab}_x = \{g \in G : gx = x\} \subset G \quad (*)$$

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Extremely non-free actions of  $G \equiv$  invariant measures on the space of Schreier graphs of  $G \equiv$  stochastically homogeneous random Schreier graphs.

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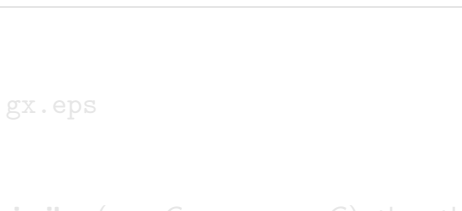
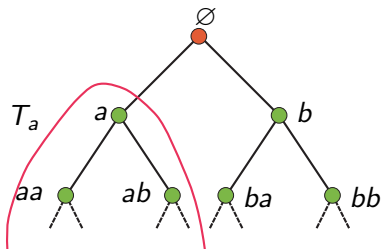


tree.eps

gx.eps

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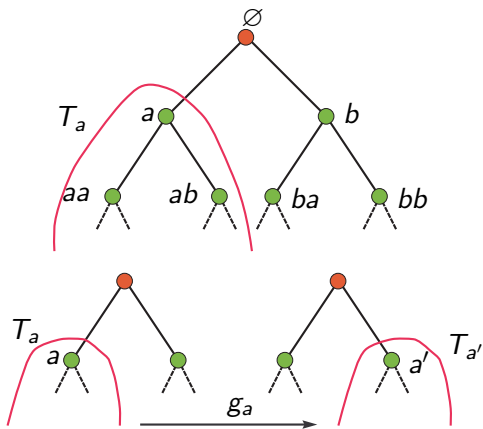


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← Return

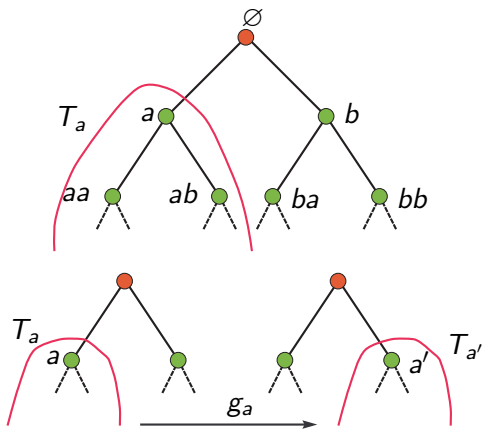


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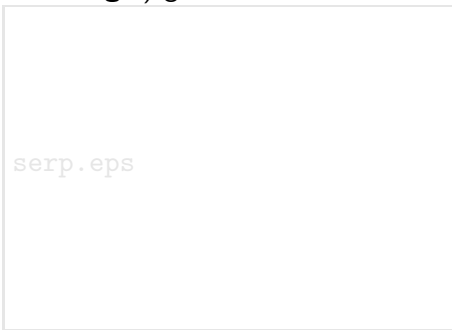
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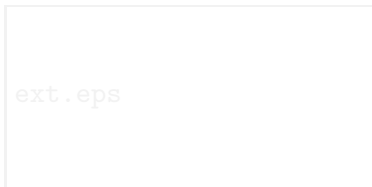


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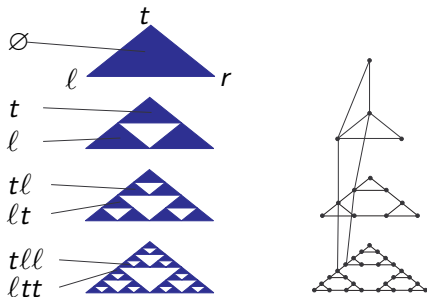


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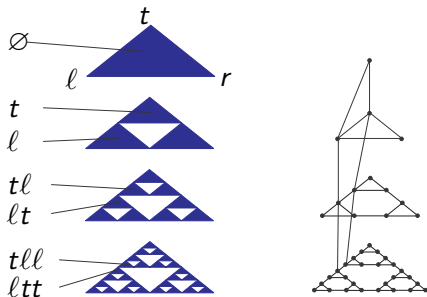


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ext . eps

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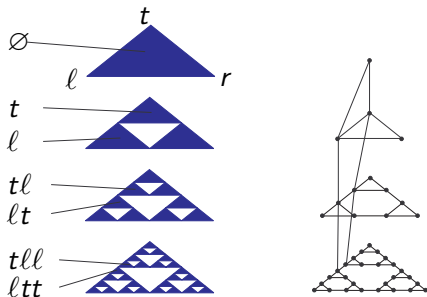


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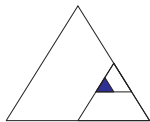
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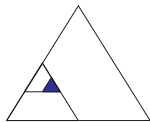
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...rll



...lrr

◀ Return

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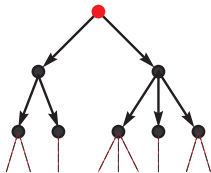
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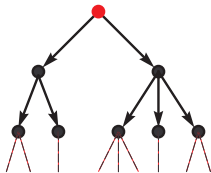
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GW2.eps

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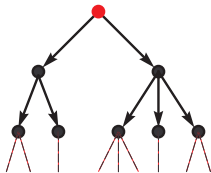
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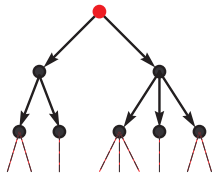
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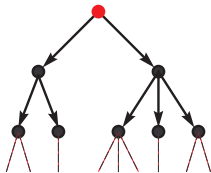
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GW2.eps

Realizations of a **branching** (*Galton-Watson*) **process** with offspring distribution  $p = (0, p_1, p_2, \dots, p_k)$  are rooted trees:



The arising measure  $\mathbf{P}$  on rooted trees is **not** invariant (the root is statistically different from other vertices!).

**Solution:** consider **augmented GW trees**: add by force one offspring to the root, i.e., use  $\tilde{p} = (0, 0, p_1, p_2, \dots)$  for the first generation, and  $p$  otherwise.

Or: start branching from an edge rather than a vertex





The **augmented measure**  $\tilde{\mathbf{P}}$  still is **not** invariant:

part.eps

$$\tilde{\mathbf{P}}(A) = p_1 \cdot p_2^2 \cdot 4p_1p_2^3 = 4p_1^2p_2^5 .$$

$$\tilde{\mathbf{P}}(A') = p_2 \cdot 3p_1p_2^2 \cdot p_2 \cdot 2p_1p_2 = 6p_1^2p_2^5 .$$

$$3/2 = \tilde{\mathbf{P}}(A')/\tilde{\mathbf{P}}(A) = \text{deg } o' / \text{deg } o$$

The measure  $\tilde{\mathbf{P}}/\text{deg}$  is invariant.

The augmented measure  $\tilde{\mathbf{P}}$  still is **not** invariant:



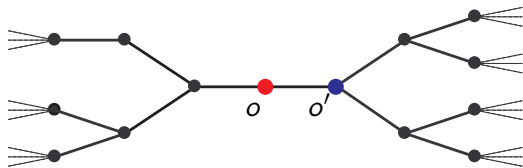
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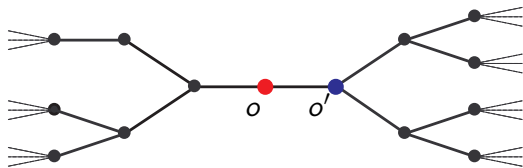
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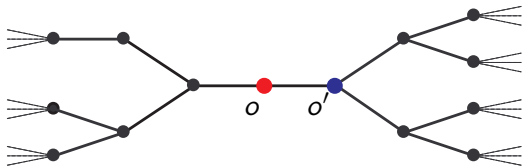
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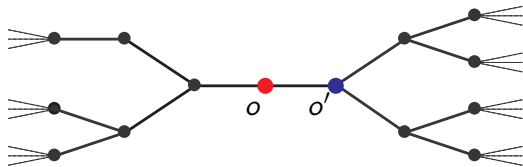
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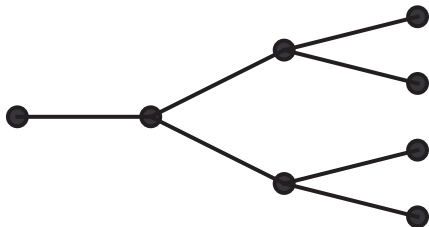


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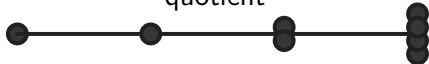
The measure  $\tilde{\mathbf{P}}/\deg$  is invariant.



invariant



quotient



Invariant and quotient measures on the equivalence class of a finite graph

