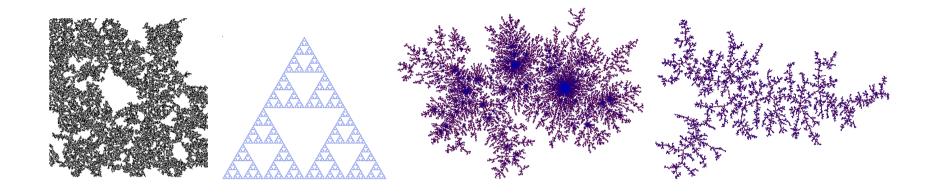
Scaling limits of random walks on random graphs: An electrical resistance approach

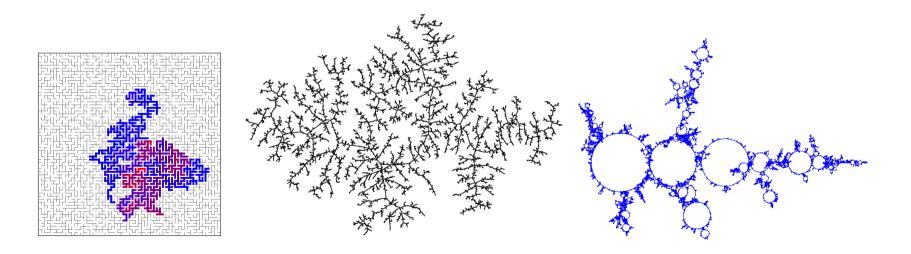
BUC Probability Meeting CIMAT, Guanajuato 16–20 January 2023

David Croydon (Kyoto) joint with O. Angel (UBC), M. T. Barlow (UBC), R. Fukushima (Tsukuba), B. M. Hambly (Oxford), S. Hernandez-Torres (UNAM), S. Junk (Tohoku), T. Kumagai (Waseda) and D. Shiraishi (Kyoto).



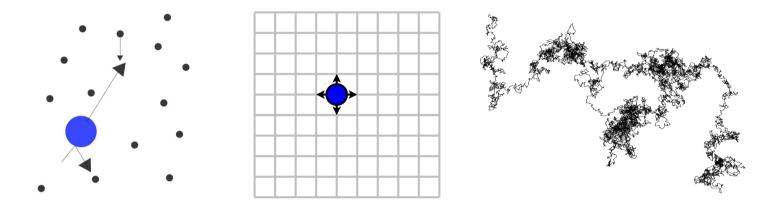


1. MOTIVATION



Sources: Ben Avraham/Havlin, Kortchemski, Chhita, Broutin.

RANDOM WALKS AND BROWNIAN MOTION



Source: Mörters/Peres.

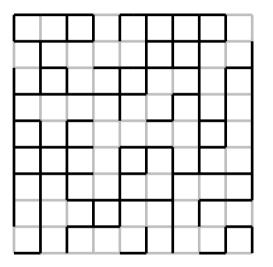
For discrete-time simple symmetric random walk $X = (X_n)_{n \ge 0}$ on integer lattice \mathbb{Z}^d $(d \ge 1)$, it holds that

$$\left(n^{-1}X_{tn^2}\right)_{t\geq 0}\to (B_t)_{t\geq 0}\,,$$

where $(B_t)_{t>0}$ is Brownian motion [Donsker 1951].

RANDOM WALK ON A PERCOLATION CLUSTER

Bond percolation on integer lattice \mathbb{Z}^d $(d \ge 2)$, parameter $p \in (0,1)$. E.g. p = 0.53:



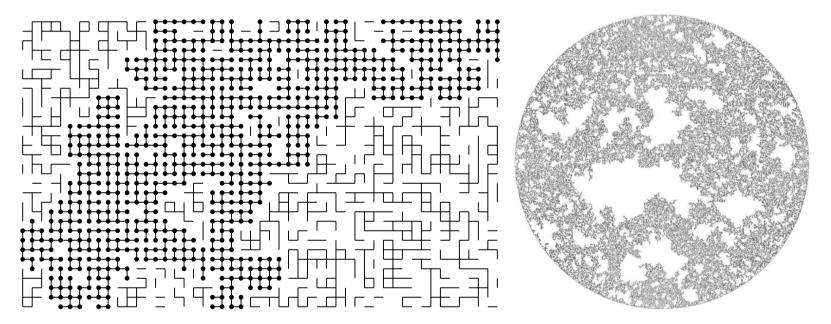
If $p > p_c(d)$, then the random walk is diffusive for P-a.e. environment. In particular,

$$\left(n^{-1}X_{tn^2}^{\mathcal{C}}\right)_{t\geq 0} \to \left(B_{c(d,p)t}\right)_{t\geq 0}$$

See [Sidoravicius/Sznitman 2004, Biskup/Berger 2007, Mathieu/Piatnitski 2007], and heat kernel bounds of [Barlow 2004].

PERCOLATION AT CRITICALITY?

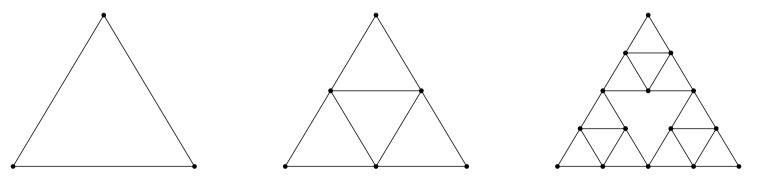
Early physics work [Alexander/Orbach 1982].



Left: Part of a large critical perc. cluster $(p = p_c(2) = 0.5)$. Right: CLE(6) gasket. *Sources: Barlow/Miller, Sun, Wilson.*

RANDOM WALK ON SELF-SIMILAR FRACTAL GRAPHS

For example, how does random walk behave on the pre-Sierpinski gasket graphs?



Answer. Can be rescaled to 'Brownian motion' on the limiting Sierpinski gasket [Goldstein 1987, Kusuoka 1987, Barlow/Perkins 1988]:

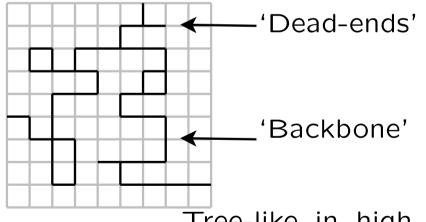
$$\left(X_{5^n t}^{(n)}\right)_{t \ge 0} \to \left(X_t^{BM}\right)_{t \ge 0}.$$

INCIPIENT INFINITE CLUSTER

At $p = p_c(d)$, it is partially confirmed that there is no infinite cluster. Instead, study the random walk on the 'incipient infinite cluster':

$$\mathcal{C}_0|\{|\mathcal{C}_0|=n\} \to \text{IIC}.$$

Constructed in [Kesten 1986] for d = 2, [van der Hofstad/Jarai 2004] for high dimensions.



Tree-like in high dimensions [Hara/Slade 2000], see also [Heydenreich, van der Hofstad/Hulsfhof/Miermont 2017].

SRW ON PERCOLATION AT CRITICALITY?

Random walk is subdiffusive for d = 2 and in high-dimensions [Kesten 1986, Nachmias/Kozma 2009], see also [Heydenreich/ van der Hofstad/Hulshof 2014].

For example, for almost-every-realisation of the IIC in highdimensions, we have:

$$\begin{split} &\frac{\log E_0^{IIC}\tau(R)}{\log R} \to 3,\\ \text{where } \tau(R) = \inf\{n: \ d_{IIC}(0, X_n^{IIC}) = R\}, \text{ and}\\ &\frac{\log E_0^{IIC}\tilde{\tau}(R)}{\log R} \to 6,\\ \text{where } \tilde{\tau}(R) = \inf\{n: \ |0 - X_n^{IIC}| = R\}. \end{split}$$

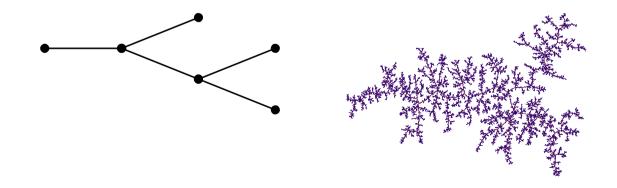
Scaling limit?

E.G. CRITICAL GALTON-WATSON TREES

Let T_n be a Galton-Watson tree with a critical (mean 1), aperiodic, finite variance offspring distribution, conditioned to have n vertices, then

$$n^{-1/2}T_n \to \mathcal{T},$$

where \mathcal{T} is (up to a constant) the **Brownian continuum random tree (CRT)** [Aldous 1993], also [Duquesne/Le Gall 2002].

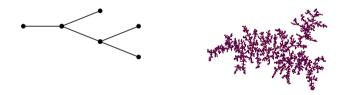


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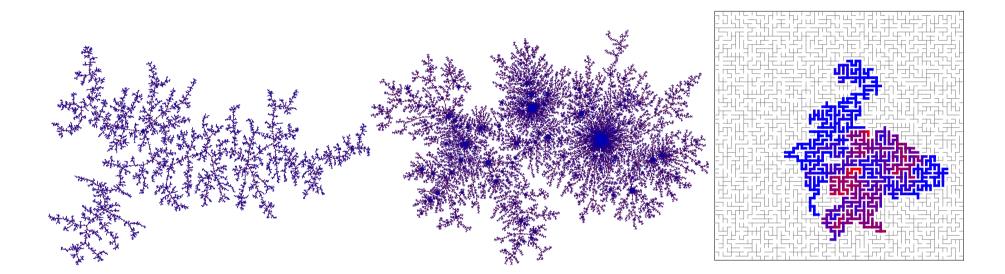


Convergence in Gromov-Hausdorff-Prohorov topology implies

$$\left(n^{-1/2}X_{n^{3/2}t}^{T_n}\right) \to \left(X_t^{\mathcal{T}}\right)_{t\geq 0},$$

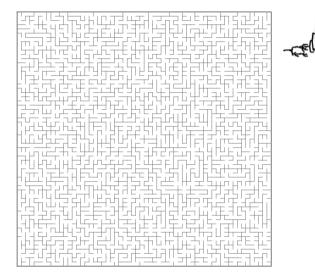
see [Krebs 1995], [C. 2008] and [Athreya/Löhr/Winter 2014].

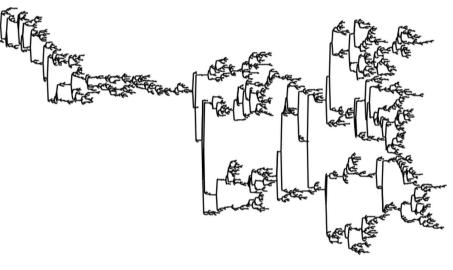
EXAMPLES OF 'CRITICAL' TREES



Finite variance Galton-Watson trees: $(n^{-1/2}X_{n^{3/2}t}^{T_n}) \rightarrow (X_t^{\mathcal{T}})_{t\geq 0}$ α -stable Galton-Watson trees: $(n^{-1/\alpha}X_{n^{1+1/\alpha}t}^{T_n}) \rightarrow (X_t^{\mathcal{T}})_{t\geq 0}$ Two-dimensional uniform spanning tree: $(n^{-1}X_{n^{13/4}t}^{\mathcal{U}}) \rightarrow (X_t^{\mathcal{T}})_{t\geq 0}$ Three-dimensional uniform spanning tree: $(n^{-1}X_{n^{4.62...t}}^{\mathcal{U}}) \rightarrow (X_t^{\mathcal{T}})_{t\geq 0}$

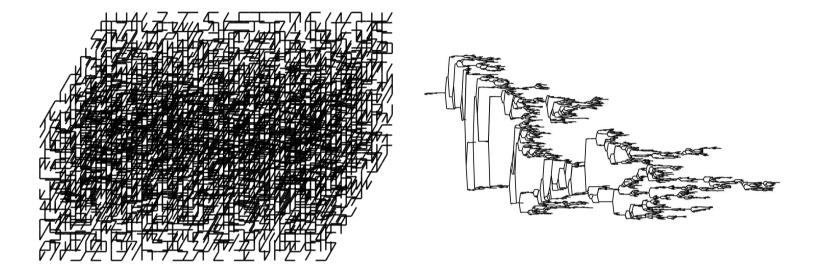
EXAMPLES OF 'CRITICAL' TREES





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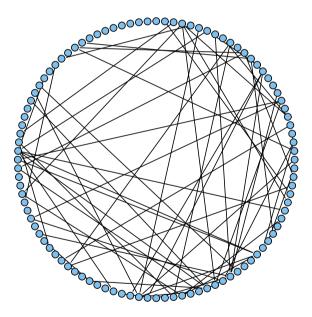
EXAMPLES OF 'CRITICAL' TREES



Finite variance Galton-Watson trees: $(n^{-1/2}X_{n^{3/2}t}^{T_n}) \rightarrow (X_t^{\mathcal{T}})_{t\geq 0}$ α -stable Galton-Watson trees: $(n^{-1/\alpha}X_{n^{1+1/\alpha}t}^{T_n}) \rightarrow (X_t^{\mathcal{T}})_{t\geq 0}$ Two-dimensional uniform spanning tree: $(n^{-1}X_{n^{13/4}t}^{\mathcal{U}}) \rightarrow (X_t^{\mathcal{T}})_{t\geq 0}$ **Three-dim. uniform spanning tree:** $(n^{-1}X_{n^{4.62...t}}^{\mathcal{U}}) \rightarrow (X_t^{\mathcal{T}})_{t\geq 0}$

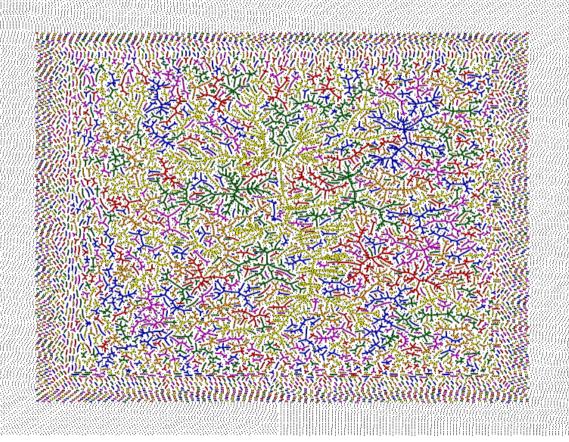
OTHER EXAMPLES OF 'CRITICAL' GRAPHS #1a

If pairs of $\{1, 2, ..., n\}$ are independently connected by an edge with probability n^{-1} , then one obtains the critical Erdős-Rényi random graph $G(n, n^{-1})$:



OTHER EXAMPLES OF 'CRITICAL' GRAPHS #1b

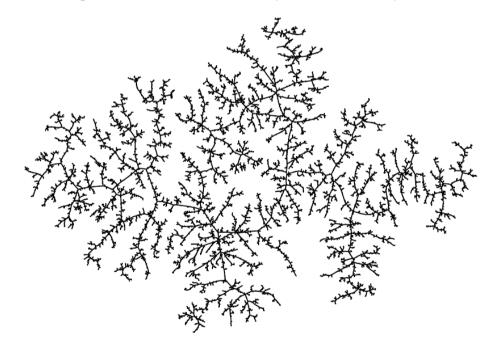
E.g. For G(n, 1/n), the components of the graph have a complex structure:



Source: Broutin, n = 40,000*.*

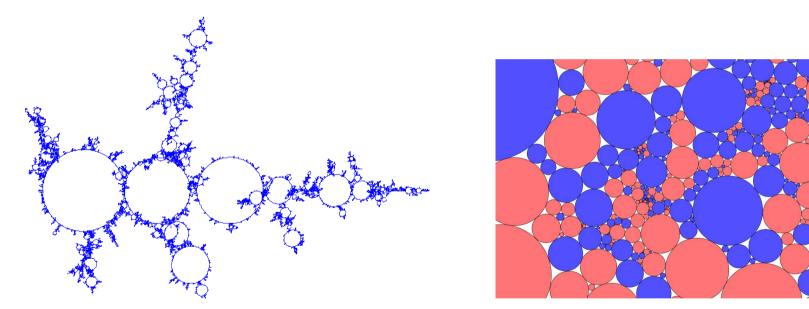
OTHER EXAMPLES OF 'CRITICAL' GRAPHS #1c

E.g. Largest connected component C_1^n of G(n, 1/n) has $n^{2/3}$ vertices and rescaling distance by $n^{1/3}$ yields a fractal scaling limit for the space [Addario-Berry/Broutin/Goldschmidt]:



OTHER EXAMPLES OF 'CRITICAL' GRAPHS #2

E.g. Discrete loop-tree given by a critical GW tree, with α -stable offspring distribution, $\alpha \in (1, 2]$.



Relates to boundary of critical percolation cluster on a random planar map [Curien/Kortchemski]. *Source: Budzinski*

RANDOM CONDUCTANCE MODEL AND BOUCHAUD TRAP MODEL

Random conductance model (RCM):

Equip edges of graphs with random weights (c(x, y)) such that

$$P(c(x,y) \ge u) = u^{-\alpha}, \qquad \forall u \ge 1,$$

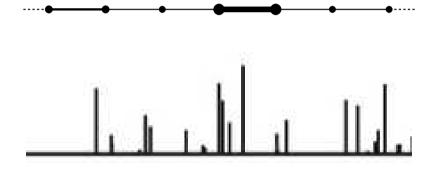
for some $\alpha \in (0, 1)$.

Symmetric Bouchaud trap model (BTM):

Add exponential holding times, mean τ_x , to vertices. In the case where τ is random and heavy-tailed, behaviour similar to RCM.

SUBDIFFUSIVITY OF RCM AND BTM IN 1D

On \mathbb{Z} , in the heavy-tailed regime, the conductance/holding time environment remains inhomogeneous in the limit:

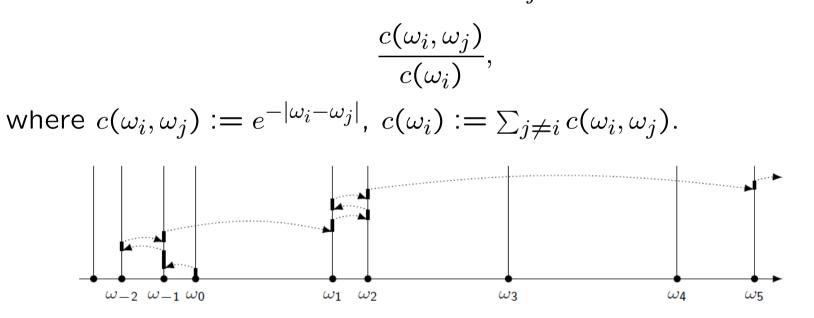


The limit measure is described as a Poisson random measure. The associated trapping leads to a subdiffusive scaling limit for the RW [Barlow/Cerny 2011, Cerny 2011]:

$$\left(n^{-1}X_{n^{1+\alpha^{-1}t}}^{RCM/BTM}\right)_{t\geq 0} \to \left(X_t^{FIN}\right)_{t\geq 0}$$

THE MOTT RANDOM WALK

Environment ($\omega = (\omega_i)_{i \in \mathbb{Z}}, \mathbf{P}$) jump times of 1-dim. Poisson process, intensity ρ , conditioned on $\omega_0 = 0$. Continuous-time random walk ($X = (X_t)_{t \ge 0}, P_\omega$) on ω with $X_0 = \omega_0$, jumping at rate 1. Probability of jumping from ω_i to ω_j is



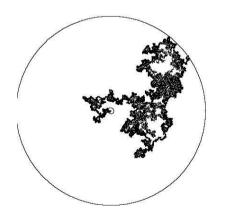
Process is diffusive if $\rho > 1$, subdiffusive if $\rho \le 1$. Scaling limits known [C./Fukushima/Junk 2021].

2. STOCHASTIC PROCESSES ASSOCIATED WITH RESISTANCE METRICS

PROBABILITY AND POTENTIAL THEORY

To study random walks on general graphs, powerful techniques are provided from the deep connections with potential theory/ electric networks.

If the boundary of a region D is held at potential f, then what is the potential inside the domain? Answer given by solution to 'Dirichlet problem':



 $\Delta v = 0 \text{ inside } D,$ $v = f \text{ on } \partial D.$

Probabilistic solution: $v(x) = E_x f(B_{\tau(\partial D)}).$

[Kakutani 1944]

RANDOM WALKS ON GRAPHS

Let G = (V, E) be a finite, connected graph, equipped with (strictly positive, symmetric) edge conductances $(c(x, y))_{\{x,y\}\in E}$. Let μ be a finite measure on V (of full-support).

Let X be the continuous time Markov chain with generator Δ , as defined by:

$$(\Delta f)(x) := \frac{1}{\mu(\{x\})} \sum_{y: y \sim x} c(x, y) (f(y) - f(x)).$$

Transition probabilities: P(x,y) = c(x,y)/c(x), where $c(x) = \sum_{\{x,y\}\in E} c(x,y)$.

Holding times: exponential, mean $\mu({x})/c(x)$.

ELECTRICAL ENERGY AND RESISTANCE METRIC

Suppose we view G as an electrical network with edges assigned conductances according to $(c(x, y))_{\{x, y\} \in E}$.

Define a quadratic form on G by setting

$$\mathcal{E}(f,g) = \frac{1}{2} \sum_{x,y:x \sim y} c(x,y) \left(f(x) - f(y) \right) \left(g(x) - g(y) \right).$$

Then $\mathcal{E}(f, f)$ is **electrical energy** dissipated in network if vertices are held at voltages according to f. Also, for any μ , \mathcal{E} is a **Dirichlet form** on $L^2(\mu)$, and

$$\mathcal{E}(f,g) = -\sum_{x \in V} (\Delta f)(x)g(x)\mu(\{x\}).$$

The effective resistance between x and y is given by

$$R(x,y)^{-1} = \inf \{ \mathcal{E}(f,f) : f(x) = 1, f(y) = 0 \}.$$

R is a metric on V, e.g. [Tetali 1991], and characterises the weights (and therefore the Dirichlet form) uniquely [Kigami 1995].

SUMMARY

RANDOM WALK X WITH GENERATOR Δ

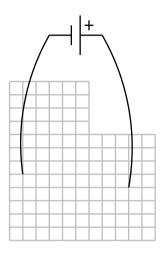
 \uparrow

DIRICHLET FORM \mathcal{E} on $L^2(\mu)$

 \uparrow

RESISTANCE METRIC R AND MEASURE μ

EXAMPLES OF CONNECTIONS



Voltages and hitting probabilities: Use battery to set v(a) = 1, v(b) = 0. Voltages in remainder of network given by

$$v(x) = P_x(\tau_a < \tau_b).$$

(Key: both sides solve discrete Dirichlet problem.)

Effective resistance and escape probabilities:

$$P_x(\tau_y < \tau_x^+) = \frac{1}{c(x)R(x,y)}$$

Effective resistance and Green's function density:

 $\frac{E_y(\text{time in } z \text{ before hitting } x)}{\mu(\{z\})} = \frac{R(x,y) + R(x,z) - R(y,z)}{2}.$

RESISTANCE METRIC, e.g. [KIGAMI 2001]

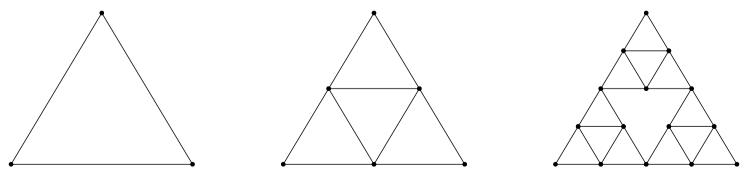
Let F be a set. A function $R : F \times F \to \mathbb{R}$ is a **resistance metric** if, for every finite $V \subseteq F$, one can find a weighted (i.e. equipped with conductances) graph with vertex set V for which $R|_{V \times V}$ is the associated effective resistance.

EXAMPLES

- Effective resistance metric on a graph;
- One-dimensional Euclidean (not true for higher dimensions);
- Any shortest path metric on a tree;
- Resistance metric on a Sierpinski gasket, where for 'vertices' of limiting fractal, we set

$$R(x,y) = (3/5)^n R_n(x,y),$$

then use continuity to extend to whole space.



RESISTANCE AND DIRICHLET FORMS

Theorem (e.g. [Kigami 2001]) There is a one-to-one correspondence between resistance metrics and a class of quadratic forms called **resistance forms**.

The relationship between a resistance metric R and resistance form $(\mathcal{E}, \mathcal{F})$ is characterised by

$$R(x,y)^{-1} = \inf \{ \mathcal{E}(f,f) : f \in \mathcal{F}, f(x) = 1, f(y) = 0 \}.$$

Moreover, if (F, R) is compact, then $(\mathcal{E}, \mathcal{F})$ is a regular Dirichlet form on $L^2(\mu)$ for any finite Borel measure μ of full support. (Version of the statement also hold for locally compact spaces.)

A FIRST EXAMPLE

Let F = [0, 1], R = Euclidean, and μ be a finite Borel measure of full support on [0, 1].

Associated resistance form:

$$\mathcal{E}(f,g) = \int_0^1 f'(x)g'(x)dx, \qquad \forall f,g \in \mathcal{F},$$

where $\mathcal{F} = \{f \in C([0,1]) : f \text{ is abs. cont. and } f' \in L^2(dx)\}.$

Moreover, integration by parts gives:

$$\mathcal{E}(f,g) = -\int_0^1 (\Delta f)(x)g(x)\mu(dx).$$

where $\Delta f = \frac{d}{d\mu} \frac{df}{dx}$.

If $\mu(dx) = dx$, then the Markov process naturally associated with Δ is reflected Brownian motion on [0, 1].

SUMMARY

RESISTANCE METRIC R AND MEASURE μ

 \uparrow

RESISTANCE FORM $(\mathcal{E}, \mathcal{F})$, DIRICHLET FORM on $L^2(\mu)$

 \uparrow

STRONG MARKOV PROCESS X WITH GENERATOR Δ , where

$$\mathcal{E}(f,g) = -\int_F (\Delta f)gd\mu.$$

3. CONVERGENCE OF RESISTANCE METRICS AND STOCHASTIC PROCESSES

MAIN RESULT [C. 2018, C./HAMBLY/KUMAGAI 2017]

Write \mathbb{F}_c for the space of marked compact resistance metric spaces, equipped with finite Borel measures of full support. Suppose that the sequence $(F_n, R_n, \mu_n, \rho_n)_{n>1}$ in \mathbb{F}_c satisfies

$$(F_n, R_n, \mu_n, \rho_n) \rightarrow (F, R, \mu, \rho)$$

in the (marked) Gromov-Hausdorff-Prohorov topology for some $(F, R, \mu, \rho) \in \mathbb{F}_c$.

It is then possible to isometrically embed $(F_n, R_n)_{n \ge 1}$ and (F, R) into a common metric space (M, d_M) in such a way that

$$P_{\rho_n}^n\left((X_t^n)_{t\geq 0}\in\cdot\right)\to P_\rho\left((X_t)_{t\geq 0}\in\cdot\right)$$

weakly as probability measures on $D(\mathbb{R}_+, M)$.

Holds for locally compact spaces if $\liminf_{n\to\infty} R_n(\rho_n, B_{R_n}(\rho_n, r)^c)$ diverges as $r \to \infty$. (Can also include 'spatial embeddings'.)

PROOF IDEA 1: RESOLVENTS

For $(F, R, \mu, \rho) \in \mathbb{F}_c$, let

$$G_x f(y) = E_y \int_0^{\sigma_x} f(X_s) ds$$

be the resolvent of X killed on hitting x. NB. Processes associated with resistance forms hit points.

We have [Kigami 2012] that

$$G_x f(y) = \int_F g_x(y,z) f(z) \mu(dz),$$

where

$$g_x(y,z) = \frac{R(x,y) + R(x,z) - R(y,z)}{2}$$

Metric measure convergence \Rightarrow resolvent convergence \Rightarrow semigroup convergence \Rightarrow finite dimensional distribution convergence.

PROOF IDEA 2: TIGHTNESS

Using that X has local times $(L_t(x))_{x \in F, t \ge 0}$, and

$$E_y L_{\sigma_A}(z) = g_A(y, z) = \frac{R(y, A) + R(z, A) - R_A(y, z)}{2},$$

can establish via Markov's inequality a general estimate of the form:

$$\sup_{x \in F} P_x \left(\sup_{s \le t} R(x, X_s) \ge \varepsilon \right) \le \frac{32N(F, \varepsilon/4)}{\varepsilon} \left(\delta + \frac{t}{\inf_{x \in F} \mu(B_R(x, \delta))} \right),$$

where $N(F, \varepsilon)$ is the minimal size of an ε cover of F .

Metric measure convergence \Rightarrow estimate holds uniformly in $n \Rightarrow$ tightness (application of Aldous' tightness criterion).

Similar estimate also gives non-explosion in locally compact case.

4. APPLICATIONS

AN EASY FIRST EXAMPLE

Discrete space/process: Space = $\{0, 1, ..., n\}$, Edge resistances = n^{-1} , Vertex masses = $\deg(x)/2n$, Process = SRW, holding time mean $1/n^2$.

Continuous space/process: [0,1] equipped with Euclidean metric, Lebesgue measure, Process = BM, reflected at boundary.

TREES

For any sequence of graph trees $(T_n)_{n\geq 1}$ such that $(V(T_n), a_n R_n, b_n \mu_n) \rightarrow (\mathcal{T}, R, \mu)$,

it holds that

$$\left(a_n^{-1}X_{ta_nb_n}\right)_{t\geq 0} \to (X_t)_{t\geq 0}.$$

- Many other interesting models...e.g. G. Andriopoulos:
- weakly biased random walk on branching random walk;
- RWRE/ERRW on trees.

CONJECTURE FOR CRITICAL PERCOLATION

Bond percolation on integer lattice \mathbb{Z}^d :

 		_	 _	
 				\neg

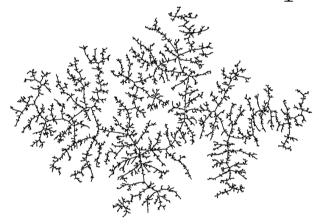
At criticality $p = p_c(d)$ in high dimensions, incipient infinite cluster (IIC) conjectured to have same scaling limit as Galton-Watson tree, e.g. [Hara/Slade 2000]. So, expect

$$\left(\mathrm{IIC}, n^{-2}R_{\mathrm{IIC}}, n^{-4}\mu_{\mathrm{IIC}}\right)$$

to converge, and thus obtain scaling limit for random walks. cf. work of [Ben Arous, Fribergh, Cabezas 2016] for branching random walk. NB. Diffusion scaling limit constructed [C. 2009]. Other graphs that are 'asymptotically trees' for which scaling limit is proved: **1-d Mott** random walk (C./Fukushima/Junk 2021), RW on range of RW (C./Shiraishi 2021).

RANDOM WALK SCALING ON CRITICAL RANDOM GRAPH

Consider largest connected component C_1^n of G(n, 1/n):



It holds that:

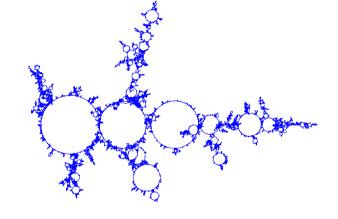
$$(\mathcal{C}_1^n, n^{-1/3} R_n, n^{-2/3} \mu_n) \to (F, R, \mu),$$

cf. [Addario-Berry, Broutin, Goldschmidt 2012]. Hence, as in [C. 2012],

$$\left(n^{-1/3}X_{tn}^n\right)_{t\geq 0}\to (X_t)_{t\geq 0}.$$

RANDOM WALK SCALING ON CRITICAL RANDOM LOOPTREES

Let L_n be a discrete loop-tree given by a critical GW tree, with α -stable offspring distribution, $\alpha \in (1, 2]$.

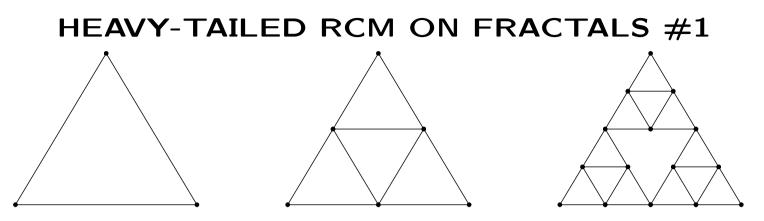


Then

$$(L_n, n^{-1/\alpha} R_n, n^{-1} \mu_n) \rightarrow (F, R, \mu),$$

[Archer 2018], cf. [Curien, Kortchemski 2014]. Hence,

$$\left(n^{-1/\alpha}X_{tn^{1+1/\alpha}}^n\right)_{t\geq 0}\to (X_t)_{t\geq 0}$$



Suppose that $P(c(x,y) \ge u) = u^{-\alpha}$ for $u \ge 1$ and some $\alpha \in (0,1)$. For gaskets, can then check that resistance homogenises [C., Hambly, Kumagai 2016]

$$(V_n, (3/5)^n R_n, 3^{-n} \mu_n) \rightarrow (F, R, \mu),$$

where:

-(up to a deterministic constant) R is the standard resistance, - μ is a Hausdorff measure on fractal.

Hence VSRW converges to Brownian motion (spatial scaling assumes graphs already embedded into limiting fractal):

 $(X_{t5^n}^n)_{t\geq 0} \to (X_t)_{t\geq 0}.$

HEAVY-TAILED RCM ON FRACTALS #2

It further holds that

$$\nu_n := 3^{-n/\alpha} \sum_{x \in V_n} c(x) \delta_x \to \nu = \sum_i v_i \delta_{x_i},$$

in distribution, where $\{(v_i, x_i)\}$ is a Poisson point process with intensity $cv^{-1-\alpha}dv\mu(dx)$. Hence CSRW (and discrete time random walk) converges:

$$\left(X_{t(5/3)^n \mathfrak{Z}^{n/\alpha}}^{n,\nu_n}\right)_{t\geq 0} \to (X_t^{\nu})_{t\geq 0},$$

where the limiting process X^{ν} is the **Fontes-Isopi-Newman** (FIN) diffusion on the limiting fractal.

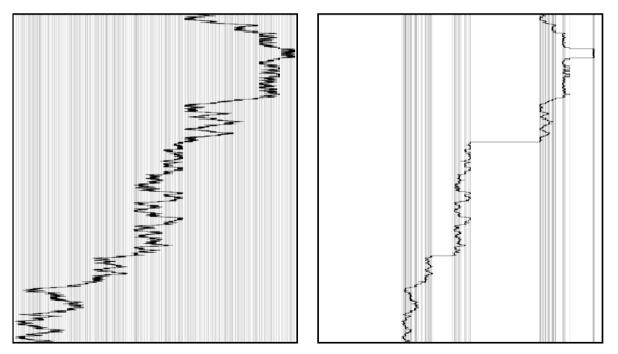
Similarly scaling result for heavy-tailed Bouchaud trap model.

MOTT RANDOM WALK

For $\rho < 1$, the Mott random walk satisfies:

$$\left(n^{-1}X_{n^{1+1/\rho_t}}\right)_{t\geq 0} \stackrel{d}{\to} \left(Z_t^{(\rho)}\right)_{t\geq 0}$$

with respect to the annealed law [C./Fukushima/Junk 2021].



Ongoing work on 'aging' with [Kious/Scali].