Anomalous random walks and diffusions: From fractals to random media

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1 Introduction

Bond percolation on $\mathbb{Z}^d (d \ge 2)$



 $\exists p_c \in (0, 1) \text{ s.t. } \exists 1 \infty \text{-cluster for } p > p_c, \text{ no } \infty \text{-cluster for } p < p_c.$

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'Anomalous' behavior of the random walk at critical probability.

Let
$$p_n^{\omega}(x,y) := P_{\omega}^x(Y_n = y)/\mu_y$$
 and

 $d_s = -2 \lim_{n \to \infty} \log p_{2n}^{\omega}(x, x) / \log n$: Spectral dimension.

Alexander-Orbach conjecture (J. Phys. Lett., '82)

 $d \ge 2 \Rightarrow d_s = 4/3 \pmod{d}$.

(It is now believed that this is false for small d.)

Motivations and Historical Remark

Analyze "anomalous" random walks or diffusions on disordered media

Math. Physicists' work since late 60's

Survey: Ben-Avraham and S. Havlin ('00)

Detailed study of heat conduction and wave transmission on

- Complicated network \Rightarrow Random walk on fractals Rammal-Toulose ('83) etc.
- Random models at critical probability (Percolation cluster etc.)

De Gennes ('76) "the ant in the labyrinth"

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- \Rightarrow Late 80's~: Kesten ('86) anomalous behavior of RW on the critical perco. cluster
- \Rightarrow Diffusions / analysis on fractals (Fractals are "ideal" disordered media)
- \Rightarrow Stability theory, global analysis \Rightarrow Applications to random media

Percolation clusters , Erdős-Rényi random graphs , Uniform spanning trees



2 Anomalous heat transfer on fractals

G: pre-Sierpinski gasket (left figure), M: Sierpinski gasket (right figure) $\{Y(n) : n = 0, 1, 2, \dots\}$: simple random walk (SRW) on G



2 Anomalous heat transfer on fractals G: pre-Sierpinski gasket (left figure), M: Sierpinski gasket (right figure) $\{Y(n): n = 0, 1, 2, \cdots\}$: simple random walk (SRW) on G $2^{-n}Y([5^nt]) \xrightarrow{n \to \infty} B_t$: Brownian motion on M [Goldstein '87, Kusuoka '87] $\Delta f(x) := \lim_{n \to \infty} 5^n (\frac{1}{4} \sum_{x_i \stackrel{n}{\sim} x} f(x_i) - f(x))$: Laplacian on M [Kigami '89]



Cf. Invariance principle on $\mathbb{R}_+ \{\tilde{Y}(i)\}$: SRW on \mathbb{Z}_+

$$2^{-n}\tilde{Y}([4^n t]) \xrightarrow{n \to \infty} B_t : \text{ Brownian motion on } \mathbb{R}_+$$



 $2^{-n}Y([5^n t]) = 2^{-n}Y([2^{d_w n} t]) \xrightarrow{n \to \infty} B_t$: Brownian motion on M

 $d_w = \log 5 / \log 2 > 2$ is called a walk dimension.

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$$2^{-n}\tilde{Y}([4^n t]) = 2^{-n}\tilde{Y}([2^{2n}t]) \xrightarrow{n \to \infty} B_t :$$
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Theorem 2.1 [Barlow-Perkins '88] <u>Heat kernel estimates $(HK(d_w))$ </u> $\exists p_t(x, y)$: jointly continuous heat kernel (HK) w.r.t. μ (Hausdorff meas.) $(P_t f(x) := E^x[f(B(t))] = \int_M p_t(x, y)f(y)\mu(dy) \ \forall x \in M, \ \frac{\partial}{\partial t}p_t(x_0, x) = \Delta p_t(x_0, x) \) \text{ s.t.}$

$$c_1 t^{-d_s/2} \exp(-c_2 (\frac{d(x,y)^{d_w}}{t})^{\frac{1}{d_w-1}}) \le p_t(x,y) \le c_3 t^{-d_s/2} \exp(-c_4 (\frac{d(x,y)^{d_w}}{t})^{\frac{1}{d_w-1}}).$$

 $d_f := \log 3 / \log 2$: Hausdorff dim., $d_s = 2 \log 3 / \log 5 < 2$: spectral dim.

Note $d_s/2 = d_f/d_w$: called the Einstein relation. (Cf. BM on \mathbb{R}^d : $d_s = d_f = d, d_w = 2$.)

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From $(HK(d_w))$, many properties can be deduced!

- $c_1 t^{1/d_w} \le E^0[d(0, B_t)] \le c_2 t^{1/d_w} \ (d_w > 2, \text{ sub-diffusive})$
- Hölder continuity of harmonic and caloric functions.
- Estimates of Green functions Laws of iterated laws etc.







Construction of BM and estimates such as (HK (d_w)): Done on various fractals. $(d_f, d_w \text{ and } d_s \text{ depend on fractals.})$

Open Prob. Existing construction of BM on the carpet (e.g. [Barlow-Bass '99]) requires detailed uniform control of harmonic functions on the approximating proc. Construct BM on the carpet without such detailed information.

3 Stability of parabolic Harnack inequalities and sub-Gaussian heat kernel estimates

Sierpinski gasket is "Too ideal"

(Q) Is the heat kernel estimate "stable" under some perturbation?

Back to the classical case

[Aronson '67] $\mathcal{L} = \sum_{i,j} \frac{\partial}{\partial x_i} (a_{ij}(x) \frac{\partial}{\partial x_j})$ on \mathbb{R}^d : sym. and uniform elliptic (i.e. $c_1 I \leq A(x) = (a_{ij}(x))_{i,j} \leq c_2 I$), then (HK(2)) holds.

$$c_1 t^{-d/2} \exp(-c_2 \frac{|x-y|^2}{t}) \le p_t(x,y) \le c_3 t^{-d/2} \exp(-c_4 \frac{|x-y|^2}{t}).$$
 (*HK*(2))

[Li-Yau '86] M: Non-cpt R-mfd, Ricci $\geq 0, \Delta$: Laplace-Beltrami \Rightarrow (HK(2)) holds.

(Q): Stability of (HK(2))?

Assume that the HK for a Dirichlet form $\mathcal{E}, \mathcal{E}(f, f) = -\int_M f(x)\mathcal{L}f(x)dx$, satisfies (HK(2)) and $\mathcal{E}'(f, f) \simeq \mathcal{E}(f, f)$ for all f. Does the HK of \mathcal{E}' satisfy (HK(2))? \Rightarrow YES! By the following characterization of (HK(2)). (M, d, μ) : metric measure space, \mathcal{E} : 'nice' Dirichlet form on $L^2(M, \mu)$ [Grigor'yan '92, Saloff-Coste '92, Sturm '96, Delmotte '99]

$(VD) + (PI(2)) \Leftrightarrow (PHI(2)) \Leftrightarrow (HK(2)).$

• (VD): volume doubling condition

$$\mu(B(x,2R)) \le c_1 \mu(B(x,R)) \qquad \forall \ x \in M, R > 0.$$

• (PI(2)): scaled Poincaré inequality $\forall B_R = B(x_0, R), R > 0$

$$\int_{B_R} (f(x) - \bar{f}_{B_R})^2 \mu(dx) \le c_1 R^2 \mathcal{E}_{B_R}(f, f), \quad \forall f$$

where $\overline{f}_B = \mu(B)^{-1} \int_B f(x)\mu(dx)$.

• (PHI(2)): parabolic Harnack inequality of order 2. 'Regularity' of caloric functions

Theorem 3.4 [Barlow-Bass '03, Barlow-Bass-K '06, Andres-Barlow '13]

$(VD) + (PI(\beta)) + (CS(\beta)) \Leftrightarrow (PHI(\beta)) \Leftrightarrow (HK(\beta)).$

 $(CS (\beta))$: cut-off Sobolev inequality **Remark.** (CS(2)) always holds.

$$\frac{c_1}{\mu(B(x,t^{1/\beta}))} \exp\big(-c_2(\frac{d(x,y)^{\beta}}{t})^{\frac{1}{\beta-1}}\big) \le p_t(x,y) \le \frac{c_3}{\mu(B(x,t^{1/\beta}))} \exp\big(-c_4(\frac{d(x,y)^{\beta}}{t})^{\frac{1}{\beta-1}}\big). \quad (HK(\beta))$$

Remark. Gasket case: $\beta = d_w = \log 5 / \log 2$, $\mu(B(x, t^{1/\beta})) = t^{d_f/d_w} = t^{d_s/2}$.

[The theorem still holds if s^{β} is replaced by $1_{\{s \leq 1\}}s^{\beta_1} + 1_{\{s>1\}}s^{\beta_2}$.]

 \Rightarrow Stability of (HK(β)) is established.



Fractal-like manifold

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 \Rightarrow Stability of (HK(β)) is established.

BUT (CS (β)) is hard to verify! **Open Prob.** Provide a simpler cond. Strongly recurrent case: simpler equiv. condition [Barlow-Coulhon-K '05] \Rightarrow Applicable for random media.

4 Random walk on percolation clusters

4.1 Supercritical case

 $(\Omega, \mathcal{F}, \mathbb{P})$: prob. space for the random media, $\mathcal{G} = \mathcal{G}(\omega)$: unique ∞ -cluster

 $\{Y_n^{\omega}\}_{n\geq 0}$: SRW on $\mathcal{G}(\omega)$ $p_n^{\omega}(x,y) := P_{\omega}^x(Y_n = y)/\mu_y$. $(\mu_y: \sharp \text{ of bonds con. to } y.)$

Although the media is not 'uniform elliptic', long time behavior is NOT anomalous.

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Although the media is not 'uniform elliptic', long time behavior is NOT anomalous. **Theorem 4.1** [Barlow '04] (Gaussian heat kernel estimates)

(HK(2)) holds \mathbb{P} -a.s. ω for $t \ge d(x, y) \lor \exists U_x, x, y \in \mathcal{G}(\omega)$.

Theorem 4.2 [Sidoravicius-Sznitman '04, Berger-Biskup '07, Mathieu-Piatnitski. '07]

(Quenched invariance principle) $n^{-1}Y_{n^2t}^{\omega} \to B_{\sigma t}$ P-a.s. ω for some $\sigma > 0$

– Cf. "Annealed" invariance principle: known since 80's

[Kipnis-Varadhan '86, De Masi-Ferrari-Goldstein-Wick '89 ($\sigma > 0$)]

 \Rightarrow Extensions to random conductance models. (Skip.)

4.2 Critical case

Percolation on \mathbb{Z}^d with d > 6 (rigorously proved for $d \ge 15$)

Let $\mathcal{C}(0)$ be the set of vertices connected to 0 by open bonds (random media!)

At $p = p_c$, $\mathcal{C}(0)$ is a finite cluster with prob. 1!

(But, in any box of side n, \exists open clusters of diam. $\asymp n$ w.h.p.)

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(But, in any box of side n, \exists open clusters of diam. $\asymp n$ w.h.p.)

 $\Rightarrow \text{Consider incipient infinite cluster (IIC)}. \ \mathbb{P}_{\text{IIC}}(\cdot) := \lim_{n \to \infty} \mathbb{P}_{p_c}(\cdot | 0 \leftrightarrow \partial B(0, n))$ (I.e. at the critical prob., conditioned on $|\mathcal{C}(0)| = \infty$.)

Belief: Local prop. of the large finite clusters can be captured

by regarding them as subsets the IIC.

Existence of the IIC known for this model. [van der Hofstad-Járai '04]

 $(\mathcal{G}(\omega), \omega \in \Omega)$: IIC, $d \geq 15$, $\{Y_n^{\omega}\}_{n\geq 0}$: SRW on $\mathcal{G}(\omega)$

Theorem 4.4 [Kozma-Nachmias '09] $\exists a_1, a_2 \ge 0$ s.t. the following hold.

(i)
$$(\log n)^{-a_1} n^{-2/3} \le p_{2n}^{\omega}(x,x) \le (\log n)^{a_1} n^{-2/3}$$
, for large n , $\mathbb{P} - a.s.$

Especially, $d_s(G(\omega)) = \frac{4}{3}$, P-a.s. ω (solves the Alexander-Orbach conjecture).

(*ii*)
$$(\log R)^{-\alpha_2} R^3 \le E^x_{\omega} \tau_{B(0,R)} \le (\log R)^{\alpha_2} R^3$$
,

for large R, $\mathbb{P}-a.s.$,

where $\tau_A := \inf\{n \ge 0 : Y_n^\omega \notin A\}.$

Why 2/3?

General result: Volume + Resistance \Rightarrow HK estimates $(\mathcal{G}(\omega), \omega \in \Omega)$: random graph on $(\Omega, \mathcal{F}, \mathbb{P}), \exists 0 \in \Omega \text{ and } D \geq 1.$ For $R, \lambda \geq 1$, we say B(0, R) is λ -good if

$$\frac{R^D}{\lambda} \le |B(0,R)| \le \lambda R^D, \quad \frac{R}{\lambda} \le R_{\text{eff}}(0,B(0,R)^c) \le R.$$

General result: Volume + Resistance \Rightarrow HK estimates $(\mathcal{G}(\omega), \omega \in \Omega)$: random graph on $(\Omega, \mathcal{F}, \mathbb{P}), \exists 0 \in \Omega \text{ and } D \geq 1$. For $R, \lambda \geq 1$, we say B(0, R) is λ -good if $\frac{R^D}{\lambda} \le |B(0,R)| \le \lambda R^D, \quad \frac{R}{\lambda} \le R_{\text{eff}}(0,B(0,R)^c) \le R.$ **Theorem 4.5** [Barlow-Járai-K-Slade '08, K-Misumi '08] If $\exists q_0 \text{ s.t. } \mathbb{P}(\{\omega : B(0, R) \text{ is } \lambda \text{-good}\}) \geq 1 - \lambda^{-q_0}$, for large $R, \lambda - (*)$. $\Rightarrow \exists \alpha_1, \alpha_2 > 0$ s.t. for \mathbb{P} -a.s. ω and $x \in \mathcal{G}(\omega), \exists N_x(\omega), R_x(\omega) \in \mathbb{N}$ the following hold $(\log n)^{-\alpha_1} n^{-\frac{D}{D+1}} \le p_{2n}^{\omega}(x,x) \le (\log n)^{\alpha_1} n^{-\frac{D}{D+1}} \quad \text{for } n \ge N_x(\omega),$ (i) $(\log R)^{-\alpha_2} R^{D+1} \le E_{\omega}^x \tau_{B(0,R)} \le (\log R)^{\alpha_2} R^{D+1}$ for $n \ge R_x(\omega)$. (ii)Especially, $d_s(\mathcal{G}(\omega)) = \frac{2D}{D+1} < 2$, \mathbb{P} -a.s. ω , and the RW is recurrent. IIC for high dim. percolation satisfies (*) with D = 2. **Open Prob.** Provide a simpler sufficient condition for $d_s \geq 2$.



IIC (for Galton-Watson branching tree): D = 2

Other examples. (i) Infinite incipient cluster (IIC) for Galton-Watson branching tree [Barlow-K '06] D = 2 and d_s = 4/3 — Quenched versions of Kesten's ('86) results.
(ii) IIC for spread out oriented percolation for d ≥ 6 [Barlow-Jarai-K-Slade '08] (d ≤ 5 No! for Branching RW [Jarai-Nachmias '13])
(iii) Invasion percolation on a regular tree. [Angel-Goodman-den Hollander-Slade '08]



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[Barlow-Jarai-K-Slade '08] $(d \le 5 \text{ No! for Branching RW [Jarai-Nachmias '13]})$ (iii) Invasion percolation on a regular tree. [Angel-Goodman-den Hollander-Slade '08] (iv) IIC for α -stable GW trees [Croydon-K '08] $D = \alpha/(\alpha - 1), d_s = 2\alpha/(2\alpha - 1)$ (v) 2-dim. uniform spanning trees [Barlow-Masson '11] $D = 8/5 = 2/(5/4), d_s = 13/5$

Below critical dimensions

• RW on the IIC for 2-dimensional critical percolation [Kesten '86]

(a) \exists of IIC for 2-dimensional crit. perco. cluster is proved.

(b) Subdiffusive behavior of SRW on IIC is proved in the following sense.

 $\exists \epsilon > 0 \text{ s.t. the } \mathbb{P}\text{-distribution of } n^{-\frac{1}{2}+\epsilon} d(0, Y_n) \text{ is tight.}$

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Remark. A-O conjecture is believed to holds for d > 6 (Critical dimension is d = 6) Numerical simulations suggest that A-O conjecture is false for $d \le 5$. $d = 5 \Rightarrow d_s = 1.34 \pm 0.02, \dots, d = 2 \Rightarrow d_s = 1.318 \pm 0.001$

Open Prob. Disprove the Alexander-Orbach conjecture in low dimensions.

Other examples in low dimensional random media

• RW on the uniform infinite planar triangulation (D = 4)

[Benjamini-Curien '13, Gurel-Gurevich and Nachmias '13]

• Liouville BM [Garban-Rhodes-Vargas '13, Berestycki '13,

Maillard-Rhodes-Vargas-Zeitouni '14, Andres-Kajino '14]

- BM on the critical percolation cluster for the diamond lattice [Hambly-K '10]
- RW on the non-intersecting two-sided random walk trace on \mathbb{Z}^2 and \mathbb{Z}^3 [Shiraishi '14]

Open Prob. 1) Lower dimensional models: prove the existence of d_s , d_w . 2) Compute resistance for random media when it is not linear order.

5 Scaling limits of random walks on random media

<u>Ex.</u> O T^N : rooted critical Galton-Watson tree (finite var.), cond. to have N vertices.

• Scaling limit of T^N is the cont. random tree \mathcal{T} (Aldous '91). Y^N : SRW on T^N .

Theorem. [Croydon '08] $\{N^{-1/2}Y^N_{[N^{3/2}t]}\}_{t\geq 0} \xrightarrow{d} \{B^T_t\}_{t\geq 0}$.

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- **<u>Ex. 1</u>** Erdős-Rényi random graph in critical window G(N, p): Erdős-Rényi random graph I.e. $V_N := \{1, 2, \dots, N\}$ vertices Percolation on the complete graph: each bond open w.p. $p \sim c/N$. \mathcal{C}^N : largest con. comp. E.g. N = 200, c = 0.8 N = 200, c = 1.2 Pictures by C. Goldschmidt.



Critical window: $p = 1/N + \lambda N^{-4/3}$ for fixed $\lambda \in \mathbb{R} \Rightarrow |\mathcal{C}^N| \asymp N^{2/3}$. (Aldous '97)

• [Addario-Berry, Broutin, Goldschmidt '12]: $\exists \mathcal{M} = \mathcal{M}_{\lambda}$ (random compact set) s.t.

 $N^{-1/3}\mathcal{C}^N \xrightarrow{d} \exists \mathcal{M} = \mathcal{M}_\lambda$ (Gromov-Hausdorff sense).

Theorem 5.1 [Croydon '12] $\{N^{-1/3}Y_{[Nt]}^{\mathcal{C}^N}\}_{t\geq 0} \xrightarrow{d} \{B_t^{\mathcal{M}}\}_{t\geq 0}$: BM on \mathcal{M}

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<u>Ex.</u> 2-dimensional uniform spanning tree (UST)

 $\Lambda_n := [-n, n]^2 \cap \mathbb{Z}^2$, let $\mathcal{U}^{(n)}$ be a spanning tree on Λ_n (no cycle)

- choose uniformly at random among all spanning trees



 \mathcal{U} : UST on \mathbb{Z}^2 is a local limit of $\mathcal{U}^{(n)}$ (spanning tree of \mathbb{Z}^2 a.s.)

• UST scaling limit: [Schramm '00] topological properties of any possible scaling lim.

[Lawler-Schramm-Werner '04] uniqueness of the scaling limit.

Theorem 5.2 [Barlow-Croydon-K '14] $\exists \{\delta_i\}_{i\geq 1} \searrow 0$ s.t. $\{\delta_i Y_{\delta_i^{-13/4}_t}^{\mathcal{U}}\}_{t\geq 0} \xrightarrow{d} \{B_t^{\mathcal{T}}\}_{t\geq 0}$.

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Theorem. In all 3 cases, $\exists p_t^{\mathcal{U}}(\cdot, \cdot)$: joint cont. HK of $B^{\mathcal{U}}$, $\exists T_0 > 0$ s.t. for \mathbb{P} -a.e. $\omega \in \Omega$,

$$p_{t}^{\mathcal{U}}(x,y) \leq c_{1}t^{-\frac{d_{f}}{d_{w}}}\ell(t^{-1})\exp\left\{-c_{2}\left(\frac{d(x,y)^{d_{w}}}{t}\right)^{\frac{1}{d_{w}-1}}\ell\left(\frac{d(x,y)}{t}\right)^{-1}\right\}$$
$$p_{t}^{\mathcal{U}}(x,y) \geq c_{3}t^{-\frac{d_{f}}{d_{w}}}\ell(t^{-1})^{-1}\exp\left\{-c_{4}\left(\frac{d(x,y)^{d_{w}}}{t}\right)^{\frac{1}{d_{w}-1}}\ell\left(\frac{d(x,y)}{t}\right)\right\}$$

for all $x, y \in \mathcal{U}, t \leq T_0$ with $\ell(x) := (1 \vee \log x)^{\theta}, (\exists \theta > 0).$

For **Ex 0, 1**, $d_f = 2, d_w = d_f + 1 = 3$, and for **Ex 2**, $d_f = 8/5, d_w = d_f + 1 = 13/5$.

6 Conclusions

Diffusions / analysis on (exactly self-similar) fractals.

 \Rightarrow Stability theory, global analysis (generalization of the classical perturbation theory).

New insights to analysis on metric measure spaces.

 \Rightarrow Applications to RW/diffusions on random media

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Future challenges • Dynamics on conformal invariant media.

• Dynamics (jump-processes) on random media with long-range correlations.

Further developments will continue to lead to important interactions

between probability, analysis and mathematical physics.

6 Conclusions

Diffusions / analysis on (exactly self-similar) fractals.

 \Rightarrow Stability theory, global analysis (generalization of the classical perturbation theory).

New insights to analysis on metric measure spaces.

 \Rightarrow Applications to RW/diffusions on random media

Future challenges • Dynamics on conformal invariant media.

• Dynamics (jump-processes) on random media with long-range correlations.

Further developments will continue to lead to important interactions

between probability, analysis and mathematical physics.

