

Invariance Principle for Variable Speed Random Walks on Trees

Wolfgang Löh, University of Duisburg-Essen

joint work with **Siva Athreya** and **Anita Winter**

STOCHASTIC ANALYSIS AND APPLICATIONS

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- ① **Donsker:** $\hat{X} = (\hat{X}_t)_{t \geq 0}$ (cont. time) RW on \mathbb{Z} , $X_t^n := \frac{1}{n} \hat{X}_{n^2 t}$
- X_t^n is RW on $\frac{1}{n} \mathbb{Z}$ with (homogeneous) jump rates $n^2 = n \cdot n$
- $\rightsquigarrow X^n \xrightarrow{\mathcal{L}} X$ in Skorohod **pathspace**, where X is Brownian motion

Variable speed BMs and RWs on \mathbb{R}

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- ② For $\sigma^{-1} \in L_{\text{loc}}^2(\lambda_{\mathbb{R}})$, want to approximate solution X of SDE

$$dX_t = \sigma(X_t) dB_t$$

- “*variable speed*”, *speed measure* $\nu = \frac{1}{\sigma^2} \cdot \lambda_{\mathbb{R}}$
 \rightsquigarrow We call X the **ν -Brownian motion** (**ν -BM**)
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Variable speed BMs and RWs on \mathbb{R}

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- Need **variable rates** for RWs X^n on $\frac{1}{n} \mathbb{Z}$ to obtain $X^n \xrightarrow{\mathcal{L}} X$.
- For measure ν_n on $\frac{1}{n} \mathbb{Z}$, let X^n jump from x at rate $\frac{n}{\nu_n(\{x\})}$
 \rightsquigarrow We call X^n the **ν_n -random walk** (**ν_n -RW**)
- **Example:** $\nu = \lambda_{\mathbb{R}}$, $\nu_n = n \cdot \#$ \rightsquigarrow situation of 1
Observe: $\nu_n \rightarrow \nu$ **vaguely**.

Speed- ν motions on \mathbb{R}

ν -BM: $\nu = \sigma^{-2}\lambda_{\mathbb{R}}$ solves $dX_t = \sigma(X_t)dB_t$; ν -RW: jump rates $\frac{n}{\nu(\{x\})}$ on $\frac{1}{n}\mathbb{Z}$

What do ν -BMs and ν -RWs have in common?

- process on $\text{supp}(\nu)$, does not jump over points in $\text{supp}(\nu)$
- *natural scale*, i.e. $\mathbb{P}_x(\{\tau_a < \tau_b\}) = \frac{b-x}{b-a}$ if $x \in [a, b]$
- *speed* determined by $\nu \rightsquigarrow$ **process characterised by ν**

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- *speed* determined by $\nu \rightsquigarrow$ **process characterised by ν**
- *time transformation* of BM: Let $L_s(x)$ be local time of B at x

$$X_t = B_{s_t}, \quad s_t = \inf\left\{s \mid \int L_s d\nu > t\right\} \quad (1)$$

- Alternative: characterise via *occupation time formula* ($x > a$)

$$\mathbb{E}_x\left(\int_0^{\tau_a} f(X_t) dt\right) = \frac{1}{2} \int_a^{\infty} f(y)(|y-a| \wedge |x-a|) \nu(dy) \quad (2)$$

- \rightsquigarrow For any *Radon measure* ν on \mathbb{R} , the **speed- ν motion** X on $\text{supp}(\nu)$ is defined by (1), or (2) + strong Markov property

Stone's invariance principle & Our goal

② SDE $dX_t = \sigma(X_t)dB_t$, $\nu = \sigma^{-2}\lambda_{\mathbb{R}}$;

ν_n -RW: rates $\frac{n}{\nu_n(\{x\})}$ on $\frac{1}{n}\mathbb{Z}$

Theorem ([STONE '63], continuity in ν of speed- ν motions)

$\nu_n \rightarrow \nu$ vaguely, $\text{supp}(\nu_n) \rightarrow \text{supp}(\nu)$ in local Hausdorff topology.

Then $X^n \xrightarrow{\mathcal{L}} X$ in pathspace. (X^n speed- ν_n motion, X speed- ν motion)

Example: can approximate SDE of ② by RWs on $\frac{1}{n}\mathbb{Z}$ with rates

$$n \cdot \nu\left(\left[x, x + \frac{1}{n}\right]\right)^{-1} = n \left(\int_x^{x+\frac{1}{n}} \frac{1}{\sigma^2(y)} dy \right)^{-1}$$

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Goal

Generalise Stone's theorem to converging trees $T_n \rightarrow T$ replacing \mathbb{R}

Example: RW on Galton-Watson tree (conditioned on size n)

$\xrightarrow{\mathcal{L}}$ BM on Aldous's *Brownian Continuum Random Tree (CRT)*

This particular case shown in [CROYDON '08: *Convergence of simple...*]

Stone's invariance principle & Our goal

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Goal

Generalise Stone's theorem to converging trees $T_n \rightarrow T$ replacing \mathbb{R}

Result (informal): *continuity* of $(T, \nu) \mapsto X$ for the speed- ν motion X on T

ToDo for precise formulation:

- ① Define what we mean by *tree*: metric measure tree (T, ν)
- ② Define *ν -motions* on metric measure trees
- ③ Define *convergence* of metric measure trees
and of processes *living on different spaces* T_n, T

A *metric space* (T, r) is **0-hyperbolic** if the *4-point condition* holds:

$$r(x_1, x_2) + r(x_3, x_4) \leq \max\{r(x_1, x_3) + r(x_2, x_4), r(x_1, x_4) + r(x_2, x_3)\}$$

0-hyperbolicity implies for $x, y, z \in T$:

- $[x, y] := \{m \in T \mid r(x, y) = r(x, m) + r(m, y)\} \subseteq T$
is isometric to a subset of the interval $[0, r(x, y)] \subseteq \mathbb{R}$,
- $\#([x, y] \cap [y, z] \cap [z, x]) \leq 1$
- If (T, r) is connected, it is an **\mathbb{R} -tree**

Note: \mathbb{R} -trees (usually) have curvature $-\infty \rightsquigarrow$ *no CD-condition*

(T, r) is **Heine-Borel** if *closed, bounded sets are compact*.

A measure ν is **boundedly-finite** if $\nu(A) < \infty$ for *bounded* $A \subseteq T$

Definition (Metric measure tree)

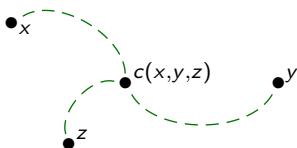
A (rooted) **metric measure tree (mm-tree)** is (T, r, ρ, ν) , where

- (T, r) is a *0-hyperbolic Heine-Borel* space with

$$[x, y] \cap [y, z] \cap [z, x] = c(x, y, z) \in T$$

- $\rho \in T$, called the **root**
- ν is a *boundedly-finite* measure on T with full support, $\text{supp}(\nu) = T$

$c(x, y, z)$ is the *branch point* corresponding to x, y, z



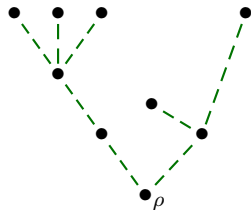
From now on, $\mathcal{X} = (T, r, \rho, \nu)$, $\mathcal{X}_n = (T_n, r_n, \rho_n, \nu_n)$ are mm-trees

Particular cases of metric trees

An **edge** in (T, r) is a pair (x, y) , $x \neq y \in T$, with $[x, y] = \{x, y\}$

finite trees

- (T, E) finite (undirected) *graph tree* with *edge weights* $r_{x,y} > 0$, $(x, y) \in E$
- Metric r on T : maximal extension of $r(x, y) := r_{x,y}$, $(x, y) \in E$
- (T, r) topologically discrete, 0-hyperbolic
- *edges* are precisely the elements of E



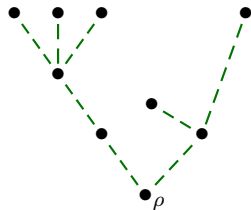
finite tree: edges (dashed) are not in the space (T, r)

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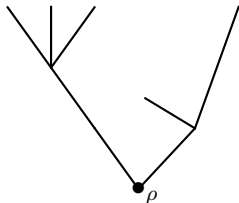
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finite tree: edges (dashed) are not in the space (T, r)

\mathbb{R} -trees

- *Connected* 0-hyperbolic \rightsquigarrow *no edges*
- infinite degrees, dense leaves possible
- Hausdorff dimension arbitrary, topological dimension one \rightsquigarrow *fractal*



corresponding **\mathbb{R} -tree:** no edges

Speed- ν motions on trees

$x = (T, r, \rho, \nu)$ is an mm-tree. Recall $T = \text{supp}(\nu)$, $c(x, y, z)$ is branch point

Proposition ([ATHREYA, L., WINTER '14⁺: *Invariance...*], compact case)

If (T, r) is compact, then there exists a **unique strong Markov process** $X = (X_t)_{t \geq 0}$ on T satisfying the **occupation time formula**

$$\mathbb{E}_x \left[\int_0^{\tau_y} f(X_s) ds \right] = 2 \int_T r(y, c(x, y, z)) f(z) \nu(dz)$$

for all $x, y \in T$, f bounded measurable, τ_y first hitting time of y . ν is **reversible** for X . We call X the **speed- ν motion** on (T, r) .

Proofidea.

Uniqueness: Resolvent calculation

Existence: Construct via **Dirichlet form** (see following slides) \square

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for all $x, y \in T$, f bounded measurable, τ_y first hitting time of y . ν is **reversible** for X . We call X the **speed- ν motion** on (T, r) .

Remark (general case)

- If (T, r) is not compact, we still get a unique strong Markov process X , also called **speed- ν motion**, by approximating with balls $B_R(\rho)$ ($R \rightarrow \infty$). Or using the Dirichlet form
- If X is recurrent, we still obtain the **occupation time formula**

The Dirichlet form

Unsurprisingly, the *Dirichlet form* of the *speed- ν motion* is defined on $L^2(\nu)$ as the closure of $(\mathcal{E}, \mathcal{D}(\mathcal{E}))$ with

$$\begin{aligned}\mathcal{E}(f, g) &= \frac{1}{2} \int_T \nabla f \cdot \nabla g \, d\lambda_T, & f, g \in \mathcal{D}(\mathcal{E}), \\ \mathcal{D}(\mathcal{E}) &= \{ f \in L^2(\nu) \cap \mathcal{C}_\infty \mid \nabla f \in L^2(\lambda_T) \},\end{aligned}$$

but we have to define the *length measure* λ_T and the *gradient* ∇ properly.

The Dirichlet form: Length measure on metric trees

$$\mathcal{E}(f, g) = \frac{1}{2} \int_T \nabla f \cdot \nabla g \, d\lambda_T, \quad \mathcal{D}(\mathcal{E}) = \{f \in L^2(\nu) \cap C_\infty \mid \nabla f \in L^2(\lambda_T)\}$$

Lemma (length measure λ_T)

There is a unique measure $\lambda_T = \lambda_{(T, r, \rho)}$ (**length measure**) with

$$\lambda_T([\rho, x]) = r(\rho, x) \quad \forall x \in T \quad \text{and} \quad \lambda_T(L) = 0,$$

where L consists of ρ and all leaves that are not isolated in (T, r) .

- For $T = \mathbb{R}$, $\lambda_{\mathbb{R}}$ is the Lebesgue-measure
- λ_T need *not* be *locally finite*, but is always *σ -finite*
- For **\mathbb{R} -trees** (i.e. (T, r) connected), λ_T is the usual length measure (1-dim. Hausdorff measure on $T \setminus L$)
 \rightsquigarrow *non-atomic* and *independent of ρ*
- If (T, r) has an **edge**, λ_T has an *atom* at the end further away from ρ . Its mass equals the length of the edge.
In particular, λ_T *depends* in this case *on ρ*

The Dirichlet form: Gradient on metric trees

$$\mathcal{E}(f, g) = \frac{1}{2} \int_T \nabla f \cdot \nabla g \, d\lambda_T, \quad \mathcal{D}(\mathcal{E}) = \{f \in L^2(\nu) \cap C_\infty \mid \nabla f \in L^2(\lambda_T)\}$$

Lemma (∇ , [ATHREYA, L., WINTER '14⁺: Invariance...])

If $f: T \rightarrow \mathbb{R}$ is *absolutely continuous*, then there exists a unique (up to λ_T -zero sets) **gradient** $\nabla f \in L^1_{\text{loc}}(\lambda_T)$ with

$$f(x) - f(\rho) = \int_{[\rho, x]} \nabla f \, d\lambda_T \quad \forall x \in T$$

- ∇ *depends on* ρ , even for \mathbb{R} -trees, where λ_T does not
- $T = \mathbb{R}_+$, $\rho = 0$: ∇ is the usual gradient on \mathbb{R}
- $T = \mathbb{R}$, $\rho = 0$: $\nabla f(x) = \text{sgn}(x)f'(x) = \pm f'(x)$
- **finite tree**: $\nabla f(x) = f(x) - f(y)$ where (x, y) is the unique edge towards ρ , i.e. with $y \in [\rho, x]$

The Dirichlet form: speed- ν motion

$$\mathcal{E}(f, g) = \frac{1}{2} \int_T \nabla f \cdot \nabla g \, d\lambda_T, \quad \mathcal{D}(\mathcal{E}) = \{f \in L^2(\nu) \cap C_\infty \mid \nabla f \in L^2(\lambda_T)\}$$

Fact [FUKUSHIMA, OSHIMA, TAKEDA '94]: To a regular Dirichlet form on $L^2(\nu)$ corresponds a ν -symmetric Markov process with generator G characterised by $\mathcal{E}(f, g) = \langle Gf, g \rangle_\nu$

Proposition ([ATHREYA, L., WINTER '14⁺: *Invariance...*])

$(\mathcal{E}, \mathcal{D}(\mathcal{E}))$ is *closable* and its closure is a *regular Dirichlet form*. The corresponding Markov process $X = (X_t)_{t \geq 0}$ is the *speed- ν motion*.

- Although λ_T and ∇ depend on ρ , the form \mathcal{E} does not
- \mathcal{E} need not be *conservative*, i.e. X may hit ∞ in finite time
- X has *continuous paths* iff (T, r) is an *\mathbb{R} -tree*, i.e. connected
- *Jumps* occur precisely over *edges*
- $T = \mathbb{R}$, $\nu = \lambda_{\mathbb{R}}$: X is standard Brownian motion
- $T = \mathbb{R}$, ν **arbitrary**: X is process considered in [STONE '63]

The Dirichlet form: speed- ν motion

$$\mathcal{E}(f, g) = \frac{1}{2} \int_T \nabla f \cdot \nabla g \, d\lambda_T, \quad \mathcal{D}(\mathcal{E}) = \{f \in L^2(\nu) \cap C_\infty \mid \nabla f \in L^2(\lambda_T)\}$$

Proposition ([ATHREYA, L., WINTER '14⁺: *Invariance...*])

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- (T, r) **\mathbb{R} -tree**: X is the ν -*BM* [ATHREYA, ECKHOFF, WINTER '13]
- (T, r) **finite tree**: X jumps from x to $y \sim x$ with rate

$$\gamma_{x,y} = (2\nu(\{x\})r(x,y))^{-1}$$

- (T, r) **finite tree with unit edge-lengths**: $r_{x,y} = 1$ for $x \sim y$.
 ν **counting measure** \rightsquigarrow *degree-dependent* total jump rate

$$\gamma_x = \sum_{y \sim x} \gamma_{x,y} = \frac{1}{2} \deg(x)$$

We get the *constant speed* (simple) RW with

$$\nu(\{x\}) = \frac{1}{2} \deg(x)$$

Convergence of mm-trees

$\mathcal{X}_n = (T_n, r_n, \rho_n, \nu_n)$, $\mathcal{X} = (T, r, \rho, \nu)$ are mm-trees. Recall $T_n = \text{supp}(\nu_n)$

Definition (Gromov-vague & Gromov-Hausdorff-vague topology)

$\mathcal{X}_n \xrightarrow{\text{Gv}} \mathcal{X}$ (**Gromov-vague** convergence) if $(T_n, r_n), (T, r)$ can be *isometrically embedded* in a *metric space* (E, d) such that, in this embedding, $\rho_n \rightarrow \rho$ and for balls $B = B_R(\rho)$ of radius R in (E, d)

$$\nu_n \upharpoonright_B \xrightarrow[n \rightarrow \infty]{w} \nu \upharpoonright_B \quad \text{for almost all } R > 0$$

- *Gv-topology* is a simple modification of *Gromov-weak topology* (finite measures) [GREVEN, PFAFFELHUBER, WINTER '09]
- *Gromov's \square_1 -metric* [GROMOV '99: *Metric structures...*] induces the Gw-topology, shown in [L. '13: *Equivalence of Gromov-Prohorov...*]

Convergence of mm-trees

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$x_n \xrightarrow{\text{Gv}} x$ (**Gromov-vague** convergence) if $(T_n, r_n), (T, r)$ can be *isometrically embedded* in a *metric space* (E, d) such that, in this embedding, $\rho_n \rightarrow \rho$ and for balls $B = B_R(\rho)$ of radius R in (E, d)

$$\nu_n \upharpoonright_B \xrightarrow[n \rightarrow \infty]{w} \nu \upharpoonright_B \quad \text{for almost all } R > 0$$

$x_n \xrightarrow{\text{GHv}} x$ (**Gromov-Hausdorff-vague** convergence) if additionally

$$T_n \cap B \xrightarrow{\text{Hausdorff}} T \cap B \quad \text{for almost all } R > 0$$

- *GHv-topology* closely related to *Gromov-Hausdorff-Prohorov* metric but subtle difference: full-support assumption / equivalence classes
- ↪ The GHP-metric is *not complete* on spaces of spaces with full support

The gap between Gv and GHv topologies

Proposition ([ATHREYA, L., WINTER '14⁺: *The gap between...*])

- The GHv-topology is *Polish*, the Gv-topology is *Lusin*
- The Gv-topology *not* Polish. It becomes Polish if we drop the *Heine-Borel* assumption

The gap between Gv and GHv topologies

Proposition ([ATHREYA, L., WINTER '14⁺: *The gap between...*])

- The GHv-topology is *Polish*, the Gv-topology is *Lusin*
- $\mathcal{X}_n \xrightarrow{\text{GHv}} \mathcal{X}$ if and only if $\mathcal{X}_n \xrightarrow{\text{Gv}} \mathcal{X}$ and the *lower mass-bound*

$$\liminf_{n \rightarrow \infty} \inf_{x \in B_R(\rho_n)} \nu_n(B_\delta(x)) > 0 \quad \forall R > 0 \quad (3)$$

In this case, (E, d) can be chosen as *Heine-Borel* space.

- Gv-topology is induced by the algebra of functions of the form

$$\Phi(x) = \int_{T^m} \varphi(r(x_i, x_j)_{i,j=0,\dots,m}) \nu^{\otimes m}(dx), \quad x_0 := \rho,$$

for $m \in \mathbb{N}$, $\varphi \in \mathcal{C}_c(\mathbb{R}^{(m+1) \times (m+1)})$. Can use Le Cam:

\rightsquigarrow For random variables: $\mathcal{X}_n \xrightarrow{\text{Gv}} \mathcal{X} \Leftrightarrow \mathbb{E}[\Phi(\mathcal{X}_n)] \rightarrow \mathbb{E}[\Phi(\mathcal{X})] \quad \forall \Phi$

- (3) acts as a *tightness condition*

Convergence of processes

We use the same *embedding approach* as for the definition of Gv- and GHV-topology to define convergence of *processes living on different spaces*:

Definition (convergence of processes on different spaces)

Let $X^n = (X_t^n)_{t \geq 0}$, $n \in \mathbb{N} \cup \{\infty\}$, be stochastic processes with values in (T_n, r_n) . We say that X^n **converges** to $X = X^\infty$ **in pathspace** or **f.d.d.** if (T_n, r_n) can be *isometrically embedded* in a *metric space* (E, d) such that, in this embedding, X^n converges to X in pathspace or f.d.d., respectively, as E -valued processes.

The Result

$\mathcal{X}_n = (T_n, r_n, \rho_n, \nu_n)$; X^n is the speed- ν_n motion on (T_n, r_n) started in ρ_n

Theorem ([ATHREYA, L., WINTER '14⁺: *Invariance principle...*])

Assume X is conservative, and consider the conditions ($R > 0$)

① *Edge-length bound:*

$$\limsup_{n \rightarrow \infty} \sup \{ r_n(x, y) \mid r_n(\rho_n, x) < R, (x, y) \text{ edge} \} < \infty$$

② *Gromov-vague convergence:* $\mathcal{X}_n \xrightarrow{\text{Gv}} \mathcal{X}$

③ *Lower mass-bound:* $\liminf_{n \rightarrow \infty} \inf_{x \in B_R(\rho_n)} \nu_n(B_\delta(x)) > 0$

④ *Diameter bound:* $\sup_n \text{diam}(T_n, r_n) < \infty$

If ①, ② and ③ hold, then X^n converges in pathspace to X .

If ①, ② and ④ hold, then X^n converges f.d.d. to X .

① is a weak condition; trivially satisfied for \mathbb{R} -trees (no edges)

④ can be weakened, but some condition is needed

② + ③ is equivalent to *Gromov-Hausdorff-vague* convergence

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③ *Lower mass-bound:* $\liminf_{n \rightarrow \infty} \inf_{x \in B_R(\rho_n)} \nu_n(B_\delta(x)) > 0$

If ①, ② and ③ hold, then X^n converges in pathspace to a process Y on the one-point compactification of T , and Y killed at infinity coincides with X

- Speed ν -motions are always killed at infinity
- The limit process Y may hit ∞ and not stay there
 - \rightsquigarrow Y loses the Markov property at ∞ and defines *entrance laws* for X from ∞

For **pathspace convergence** (under the **lower mass-bound**):

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- 2 **Strong Markov property** of all limit processes (compact case)
 - show *equicontinuity* of the maps $P_n: (t, x) \mapsto \mathcal{L}_x(X_t^n)$, $n \in \mathbb{N}$, where \mathcal{L}_x is the law of a process started in x ; use *Arzelà-Ascoli*
- 3 Show **occupation time formula** for all limit processes
 - \rightsquigarrow All *limit processes coincide* with X in the compact case
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For the **f.d.d.-case** (without the **lower mass-bound**):

- 5 $\hat{T}_n \subseteq T_n: \nu_n(T_n \setminus \hat{T}_n) < \varepsilon$, (\hat{T}_n, r_n, ν_n) *satisfies mass-bound*
- 6 Show **closeness of marginals** of X^n and \hat{X}^n
 - Use a simple *heat-kernel bound* satisfied for speed- ν motions X :
$$\|q_t(x, \cdot)\|_2^2 \leq \nu(T)^{-1} + \text{diam}(T) \cdot t^{-1} \quad \forall x \in T, t > 0$$
- 7 Use *pathspace convergence* of \hat{X}^n and Markov property

Thank you for your attention!

Arigatō gozaimasu!