

Optimal transport, heat flow and coupling of Brownian motions

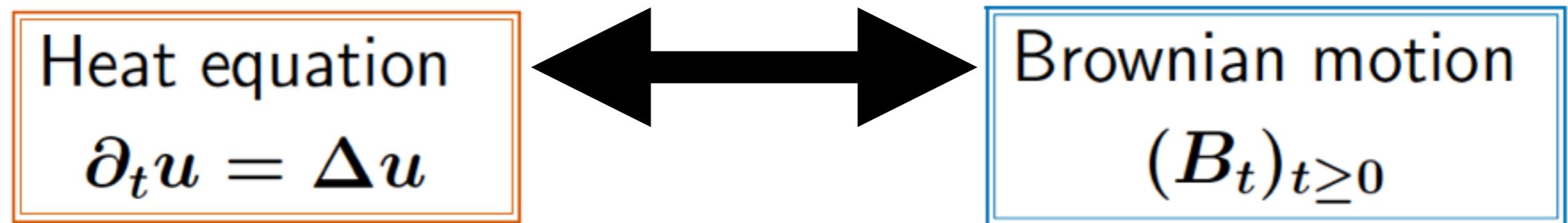
桑田 和正

(東京工業大学大学院理工学研究科数学専攻)

偏微分方程式に付随する確率論的問題
京都大学数理解析研究所 2015 年 12 月 9–11 日

1. Introduction

Heat equation \leftrightarrow Brownian motion



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$$u(t, x) = \mathbb{E}[u(0, B_t) \mid B_0 = x]$$

Heat equation

$$\partial_t u = \Delta u$$

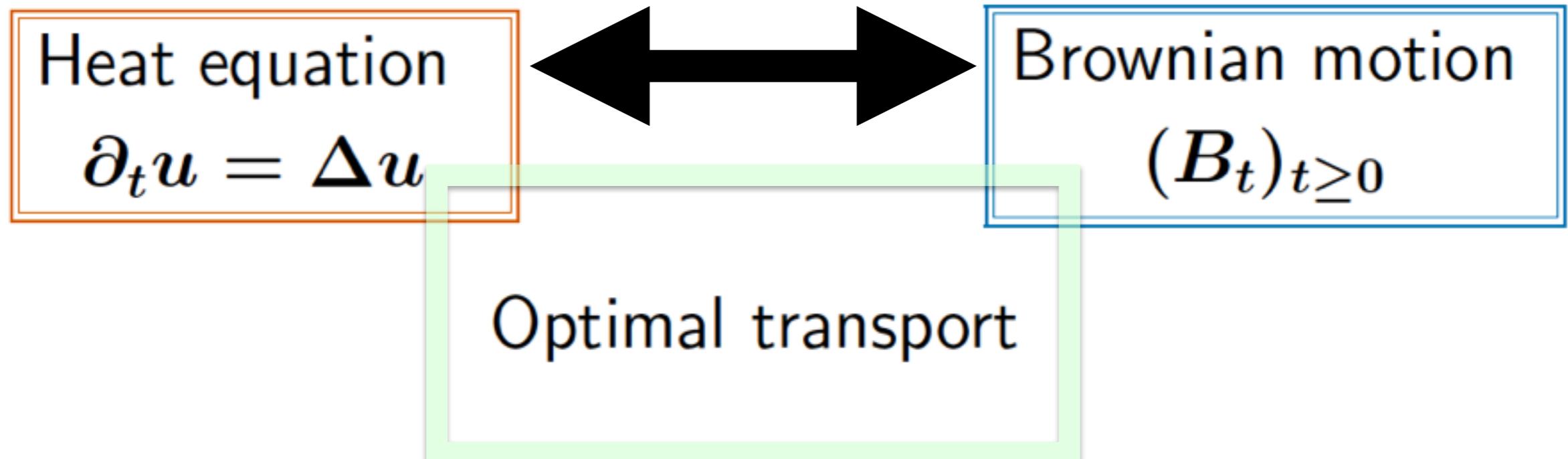
Brownian motion

$$(B_t)_{t \geq 0}$$



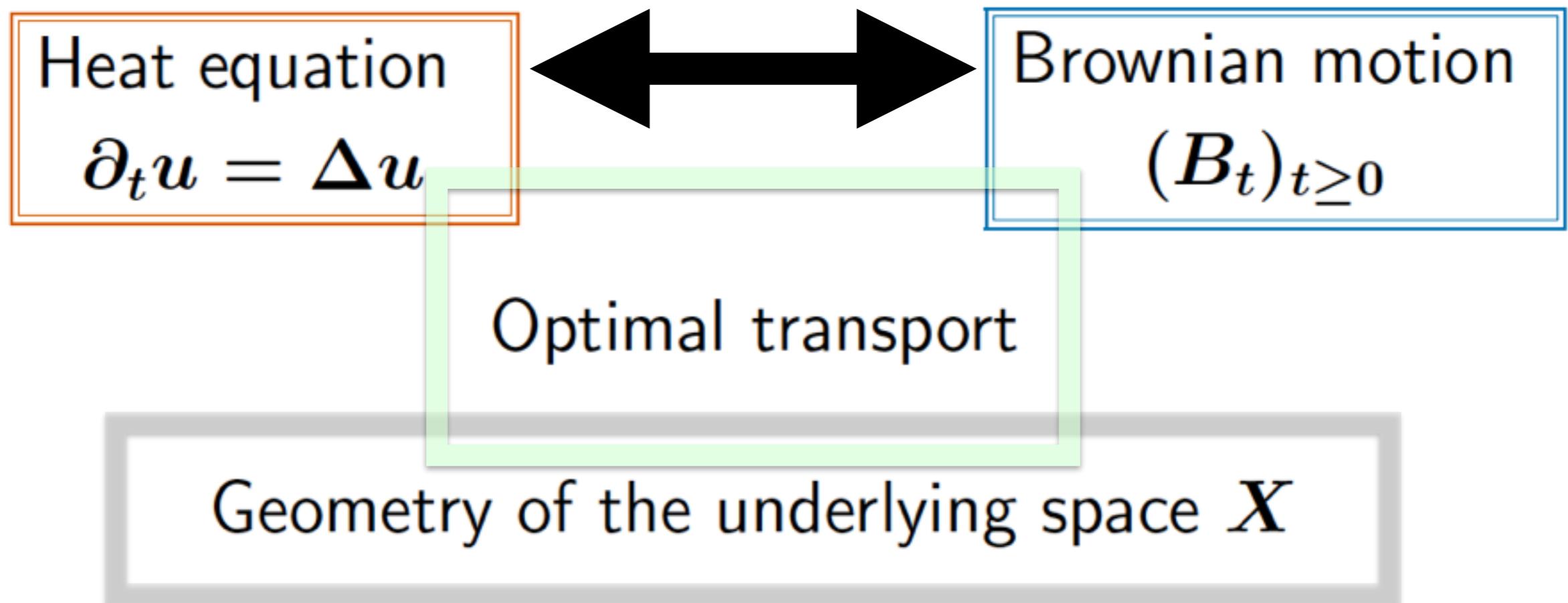
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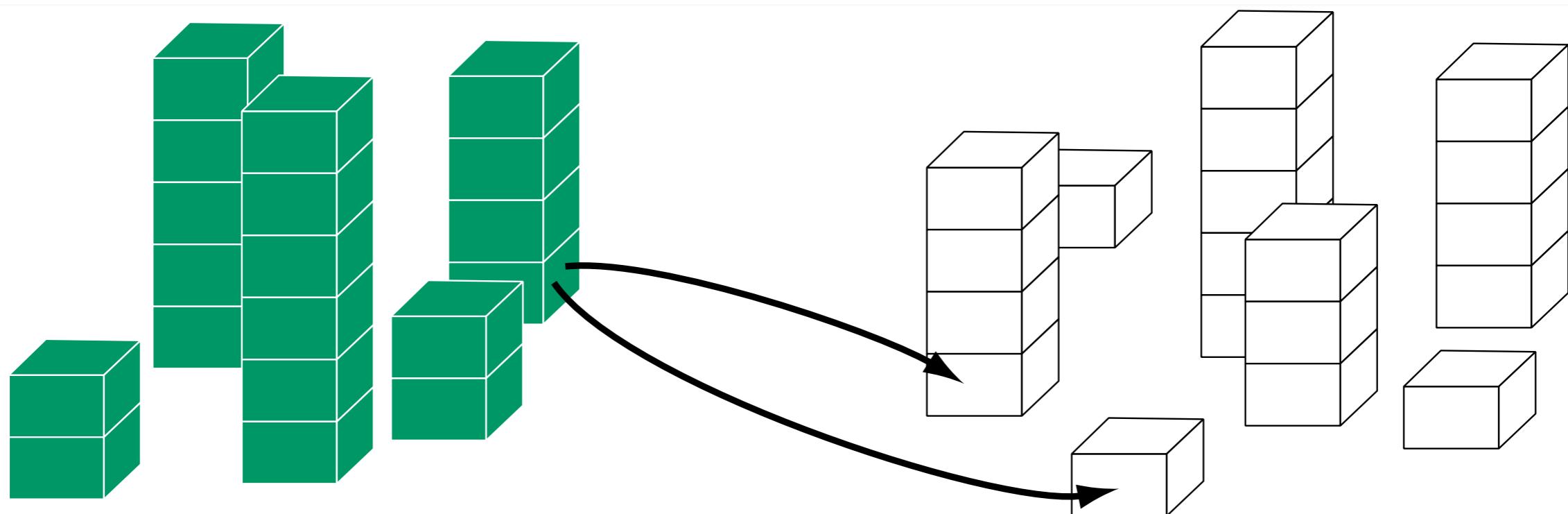


What's optimal transport?

- Bring a mass $\mu_0 \in \mathcal{P}(X)$ to $\mu_1 \in \mathcal{P}(X)$
- $c(x, y)$: cost to bring a unit mass from x to y

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Q.

- How do we minimize the total cost?
- Properties of the optimal cost (as a fn. of μ_0, μ_1)?
 - ↳ “difference” of μ_0 and μ_1



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Behavior of $\text{Ent}(\mu_t) \Leftrightarrow$ Curvature of X
(Curvature-dimension condition)

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Characterizations of curv.-dim. cond'n by $(\nu_t)_{t \geq 0}$

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- Non-smooth spaces (metric measure spaces):
† Opt. trans./Heat flow work well.
⇒ Many applications in Analysis/Geometry

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How about BMs?

Outline of the talk

- 1. Introduction**
- 2. Basics of optimal transport**
- 3. Framework**
- 4. Some couplings of Brownian motions**
 - 4.1 Coupling by parallel transport
 - 4.2 Coupling by reflection
- 5. Concluding remarks**

1. Introduction

2. Basics of optimal transport

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Optimal Transportation cost

(X, d) : Polish metric space

$c : X \times X \rightarrow [0, \infty)$: symm., conti.

Opt. trans. cost

$$\mathcal{T}_c(\mu, \nu) := \inf_{\pi \in \Pi(\mu, \nu)} \left[\int_{X \times X} c \, d\pi \right]$$

$$\Pi(\mu, \nu) := \left\{ \pi \in \mathcal{P}(X^2) \mid \begin{array}{l} \pi(A \times X) = \mu(A) \\ \pi(X \times A) = \nu(A) \end{array} \right\}$$

(Couplings/Transference plans)

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Basic problems in Opt. Trans.

- Characterizations of minimizer(s)
(e.g. \rightsquigarrow Monge-Ampère eq.)
- Trends to equilibrium in opt. trans. cost
- Functional inequalities
(e.g. Sobolev ineq./isoperimetric ineq.)
- Additional constraints
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Other connections

with optimal control/Hamilton-Jacobi eq., Euler eq., ...

Kantorovich duality

$$\mathcal{T}_c(\mu, \nu) = \sup_{g, f} \left[\int_X g \, d\mu + \int_X f \, d\nu \right]$$

where $f, g \in C_b(X)$,

$$g(x) + f(y) \leq c(x, y)$$

Kantorovich duality

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↔ Connection with

Hopf-Lax formulae & associated H.-J. eq.'s

Wasserstein distance

L^p -Wasserstein distance ($p \in [1, \infty)$)

$$W_p(\mu, \nu) := \mathcal{T}_{d^p}(\mu, \nu)^{1/p} \left(= \inf_{\pi \in \Pi(\mu, \nu)} \|d\|_{L^p(\pi)} \right)$$

- W_p : (pseudo-)distance
- Conv. in $W_p \Leftrightarrow$ weak conv. & unif. p -th moment
- Property of $(X, d) \Rightarrow$ the same for $(\mathcal{P}(X), W_p)$

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† Geodesic distance:

$\forall x_0, x_1, \exists$ length-minimizing curve (min. geod.) joining x_0 and x_1

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Grad. flow on $(\mathcal{P}(X), W_2)$

Otto calculus (Formal Riem. str. $\longleftrightarrow W_2$)

- Tangent vect. at μ : $\nabla \varphi \in L^2(\mu)$ ($\varphi : X \rightarrow \mathbb{R}$)
- $\dot{\mu}_t = \nabla \varphi \stackrel{\text{"def"}}{\iff} \frac{d}{dt} \int_X f d\mu_t = \int_X \langle \nabla \varphi, \nabla f \rangle d\mu_t$
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Other gradient flows on $(\mathcal{P}(X), W_2)$:

Porous medium eq./McKean-Vlasov eq./ p -heat eq./...

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Framework

(X, d, \mathfrak{m}) : Polish geodesic metric measure sp.,

\mathfrak{m} : loc. finite, σ -finite, $\text{supp } \mathfrak{m} = X$,

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$$= \int_X |\nabla f|_w^2 d\mathfrak{m}$$

$$\star |f(\gamma_1) - f(\gamma_0)| \leq \int_0^1 |\nabla f|_w(\gamma_s) |\dot{\gamma}_s| ds$$

for a.e. trajectories $(\gamma_s)_{s \in [0,1]}$ of “nice” transports

RCD(K, ∞) space

$$\text{Ent}(\rho m) := \int_X \rho \log \rho dm$$

Definition 1

(X, d, m) : Riemannian **CD(K, ∞)** sp. ($K \in \mathbb{R}$)
 $\overset{\text{def}}{\Leftrightarrow}$ “Hess Ent $\geq K$ ” on $(\mathcal{P}(X), W_2)$
& **Ch**: quadratic form ($\Leftrightarrow P_t$: linear)

$$\frac{\text{Hess Ent} \geq K}{\forall \mu_0, \mu_1 \in \mathcal{P}(X), \exists (\mu_t)_{t \in [0,1]}: W_2\text{-min. geod. s.t}}$$

$$\text{Ent}(\mu_t) \leq (1-t)\text{Ent}(\mu_0) + t\text{Ent}(\mu_1) - \frac{K}{2}t(1-t)W_2(\mu_0, \mu_1)^2$$

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RCD(K, ∞) space

Examples

- (M, g) : cpl. Riem. mfd, $\partial M = \emptyset$, V : fn. on M
 $\rightsquigarrow (M, d_g, \mathfrak{m})$ (d_g : Riem. dist., $\mathfrak{m} = e^{-V} \text{vol}_g$)
 $\rightsquigarrow \mathbf{RCD}(K, \infty) \Leftrightarrow \text{Ric} + \text{Hess } V \geq K$
- $M = \mathbb{R}^d$, $V(x) = \frac{K|x|^2}{2}$
 $(\rightsquigarrow \partial_t u = \Delta u - Kx \cdot \nabla u)$
- Meas. Gromov-Hausdorff lim. of $\mathbf{RCD}(K, \infty)$ sp.'s
- Stable under “natural” geometric operations

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- Meas. Gromov-Hausdorff lim. of $\mathbf{RCD}(K, \infty)$ sp.'s
- Stable under “natural” geometric operations

$\mathbf{RCD}(K, \infty)$ space

Examples

- (M, g) : cpl. Riem. mfd, $\partial M = \emptyset$, V : fn. on M
 $\rightsquigarrow (M, d_g, \mathfrak{m})$ (d_g : Riem. dist., $\mathfrak{m} = e^{-V} \text{vol}_g$)
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$\overset{\text{def}}{\Leftrightarrow}$ “Hess Ent $\geq K$ ” on $(\mathcal{P}(X), W_2)$

& **Ch**: quadratic form ($\Leftrightarrow P_t$: linear)

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[Ambrosio, Gigli & Savaré '15]

Analytic properties of $\text{RCD}(K, \infty)$ sp.

- (Quantitative) Lipschitz regularization of P_t :
 $P_t f$: Lipschitz for $f \in L^\infty(\mathfrak{m})$
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Gaussian isoperimetry/log-Sobolev/Talagrand/...
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Where's stochastic analysis?

$$\mathbb{W}_2(K, \infty) \Rightarrow W_2(\delta_x P_t, \delta_y P_t) \leq e^{-Kt} d(x, y)$$

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Q.

- Something more for sample paths of BMs?
- In particular, coupling of BMs?

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(M, g) : cpl. Riem. mfd, $\text{Ric} \geq K$

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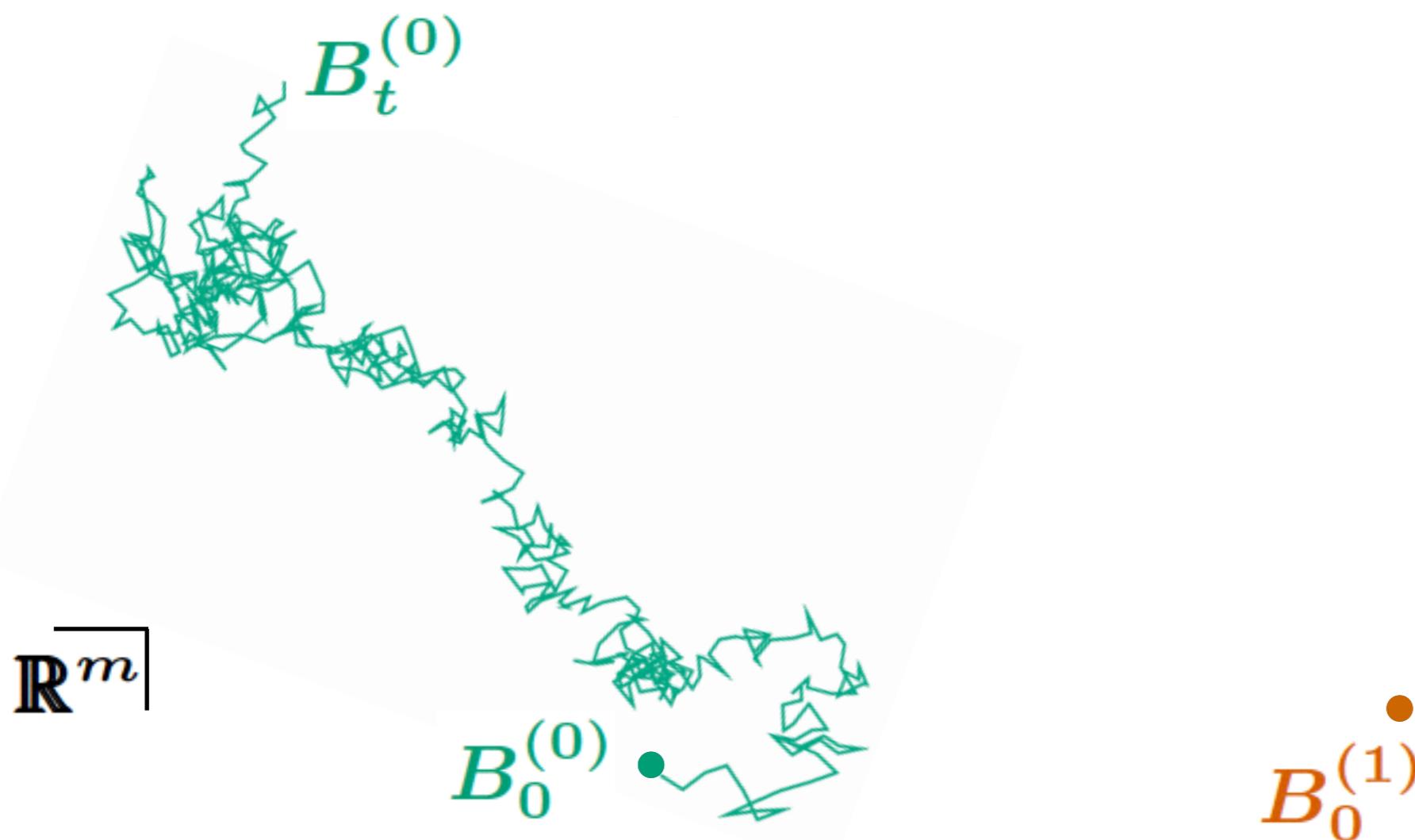
$B_0^{(0)}$ •

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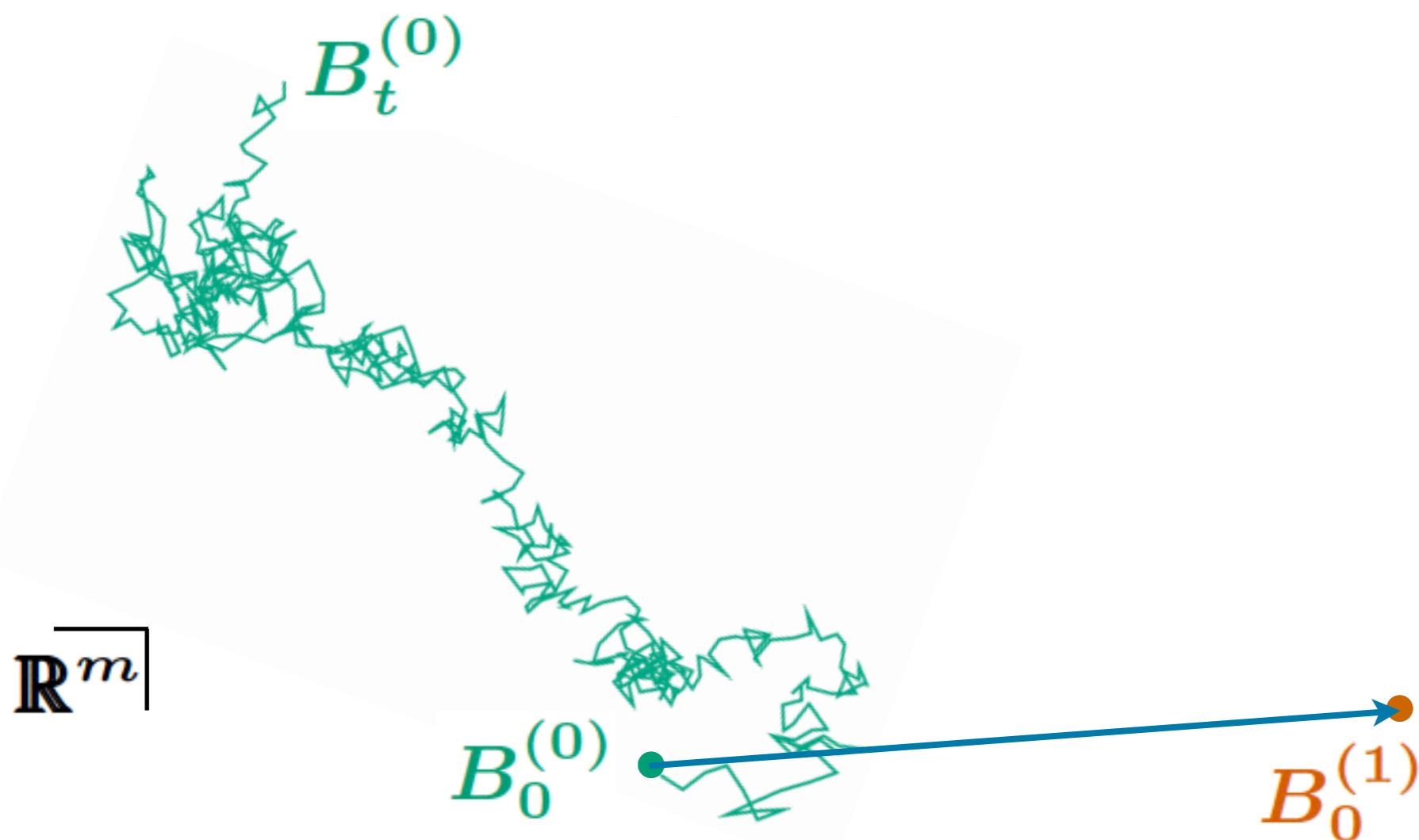
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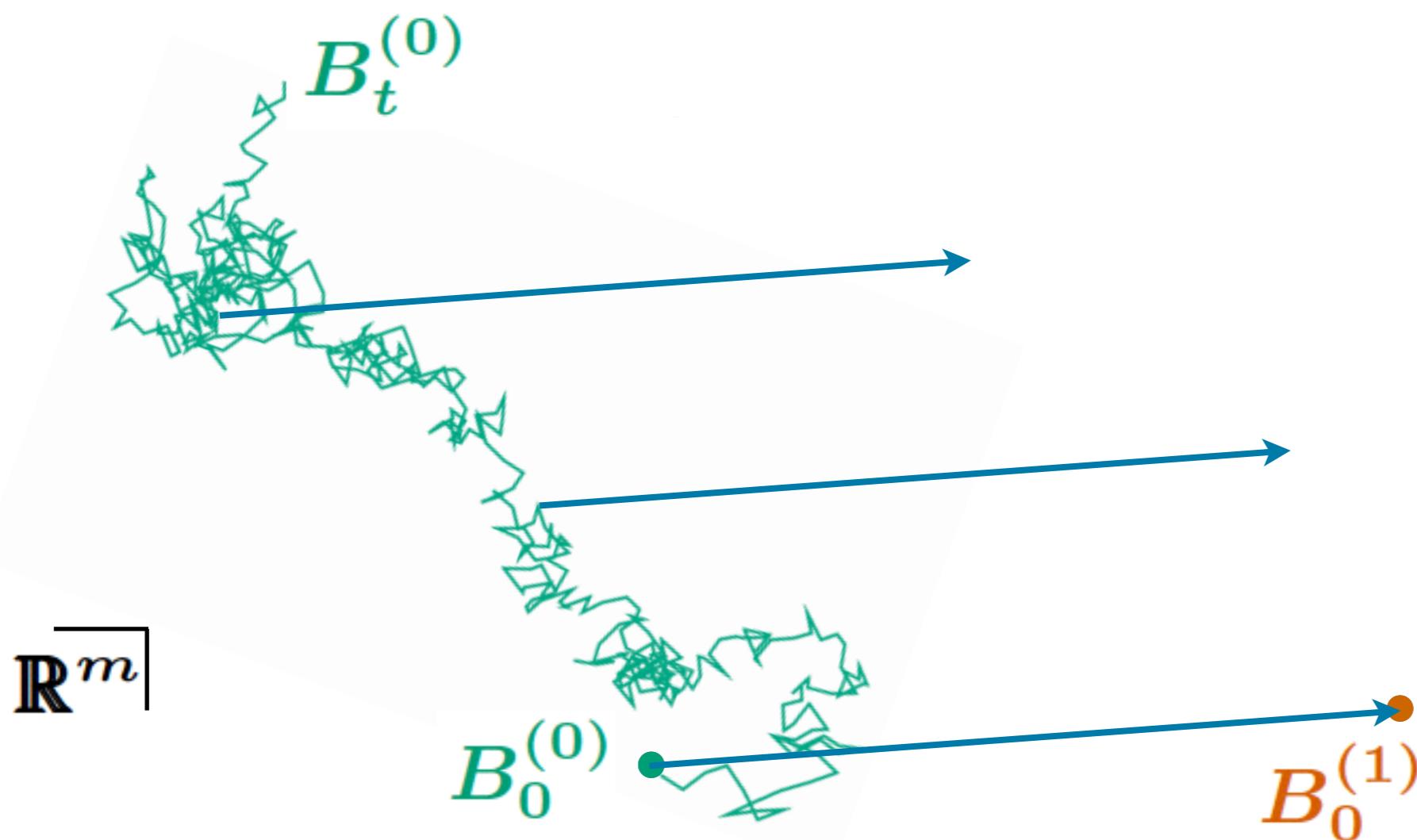
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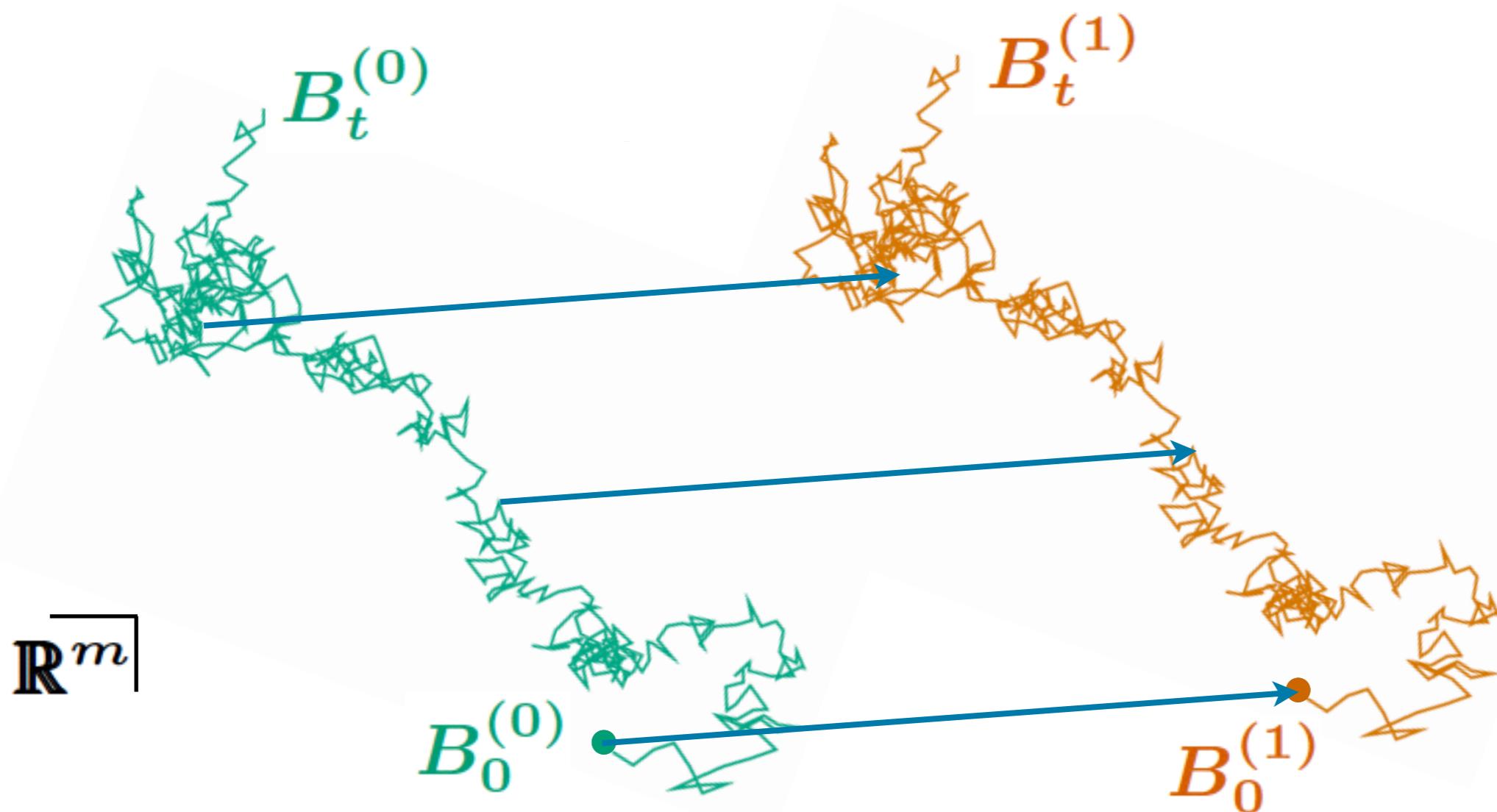
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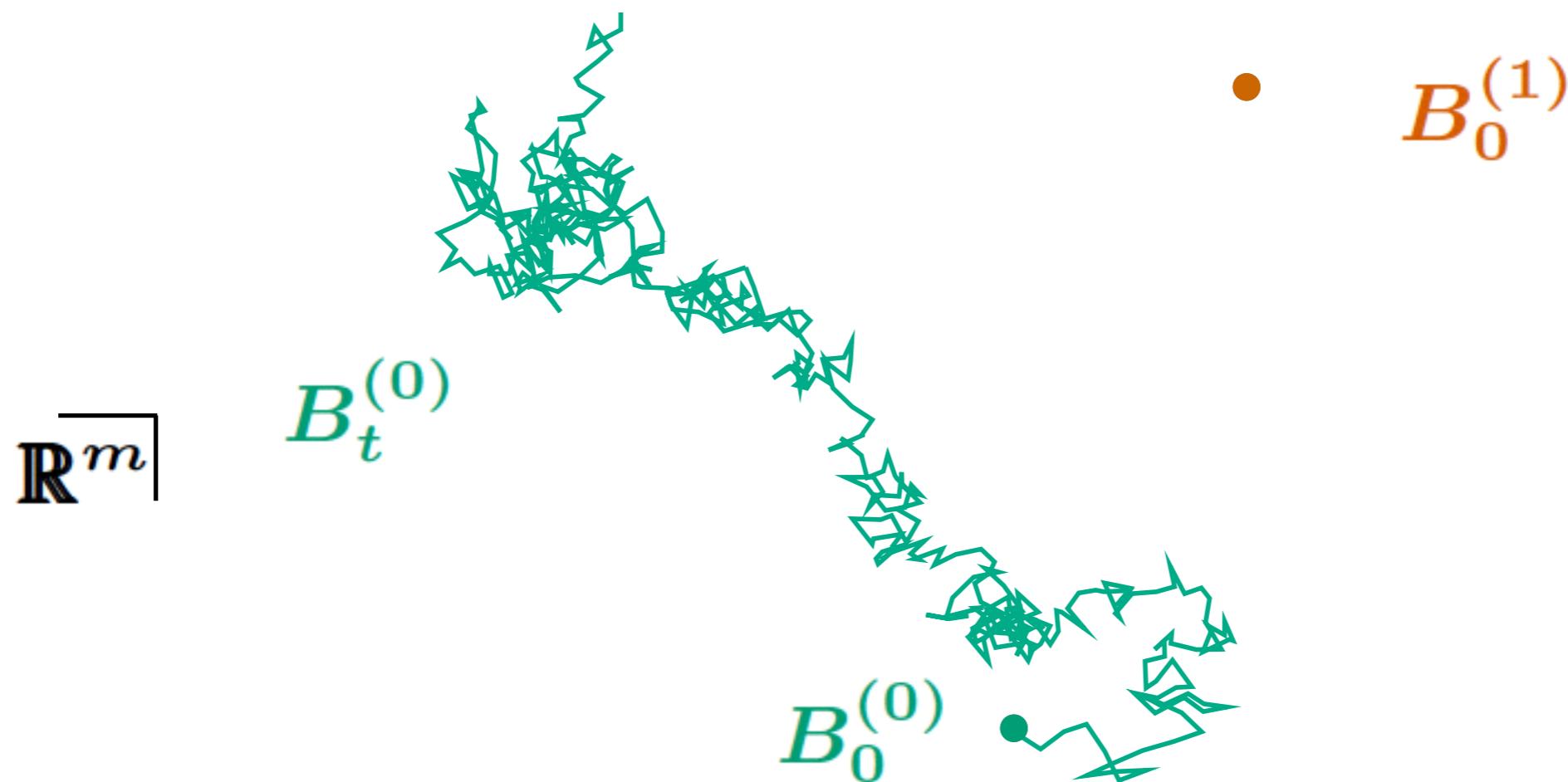
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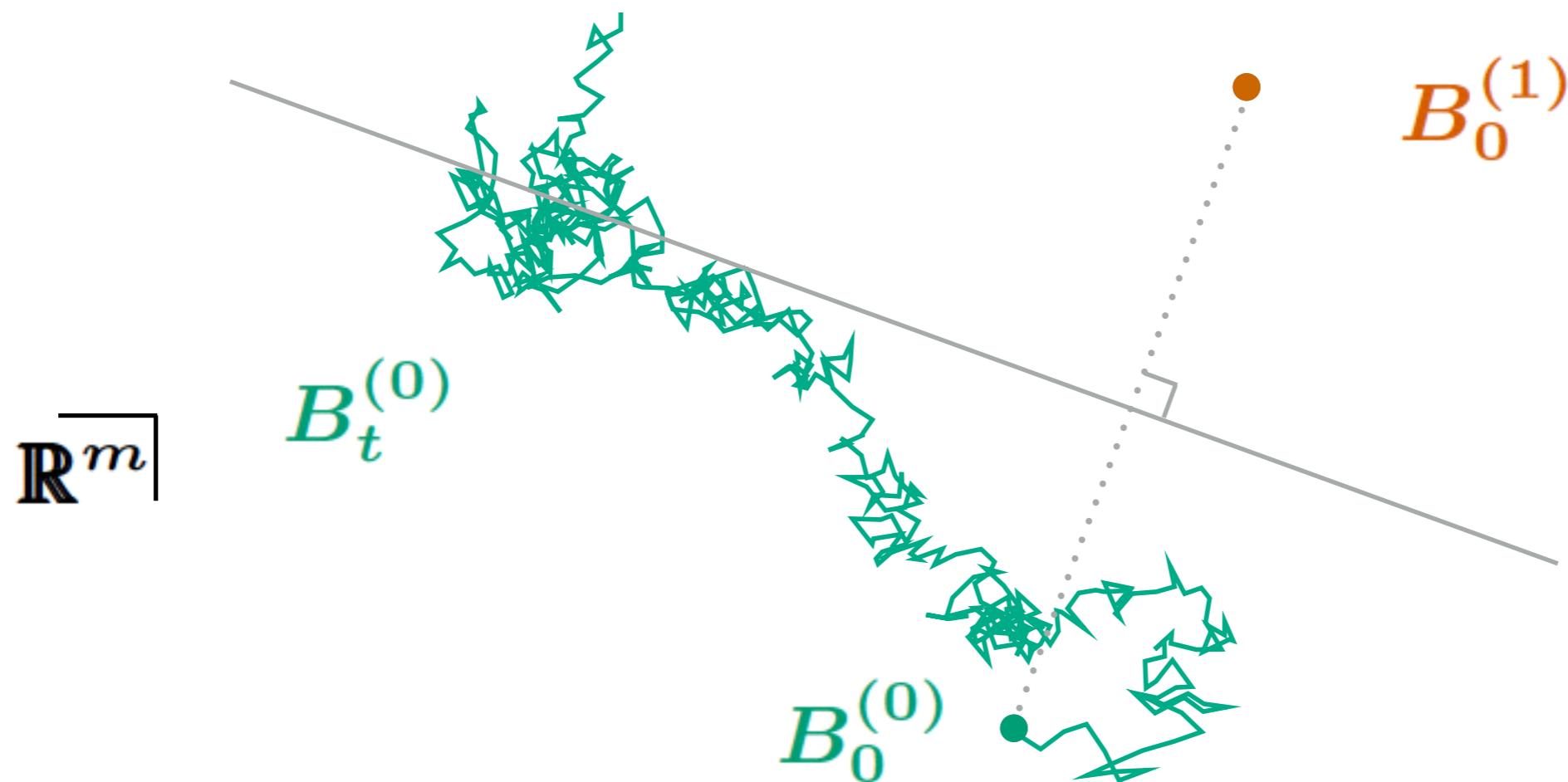


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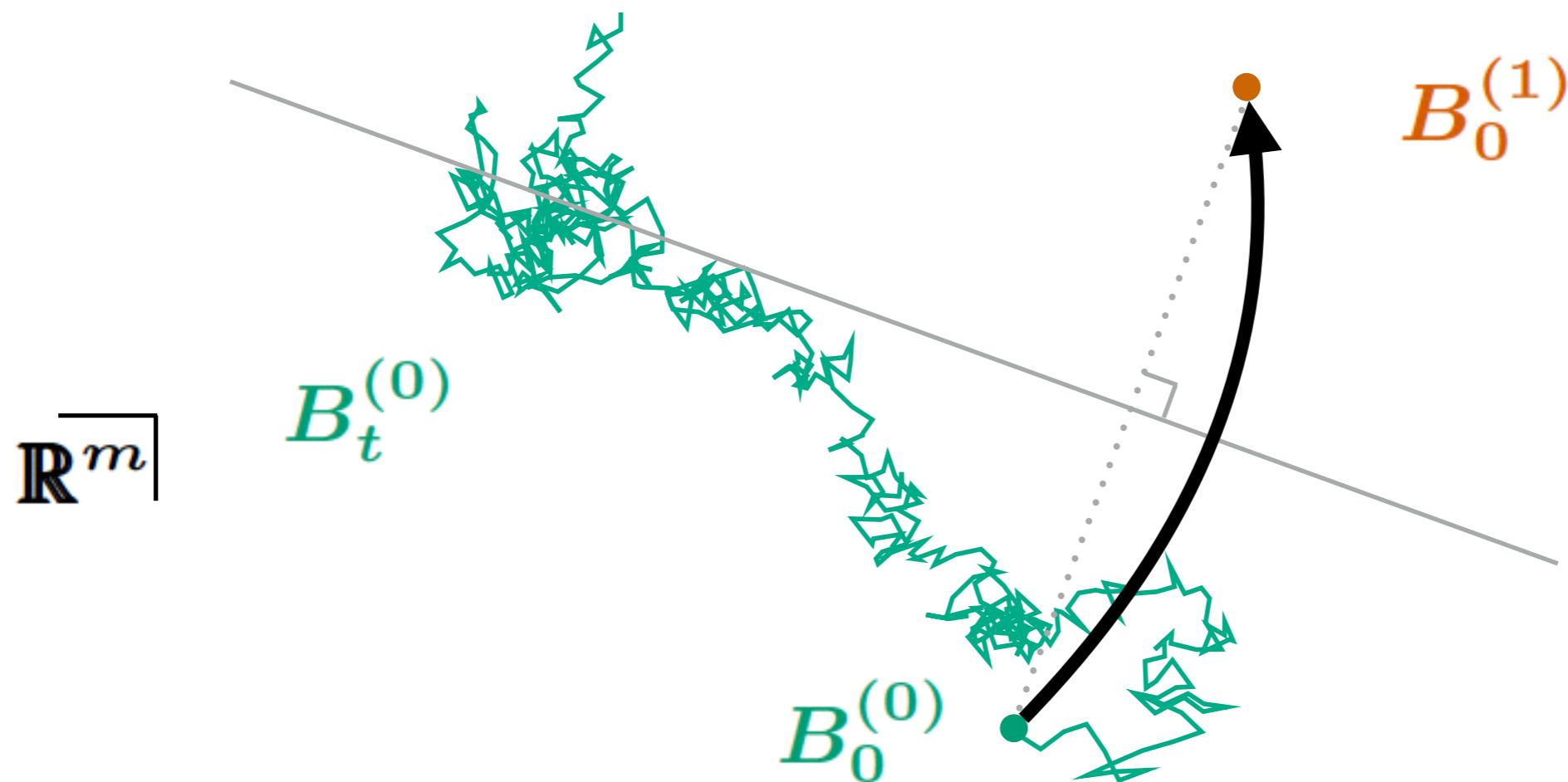


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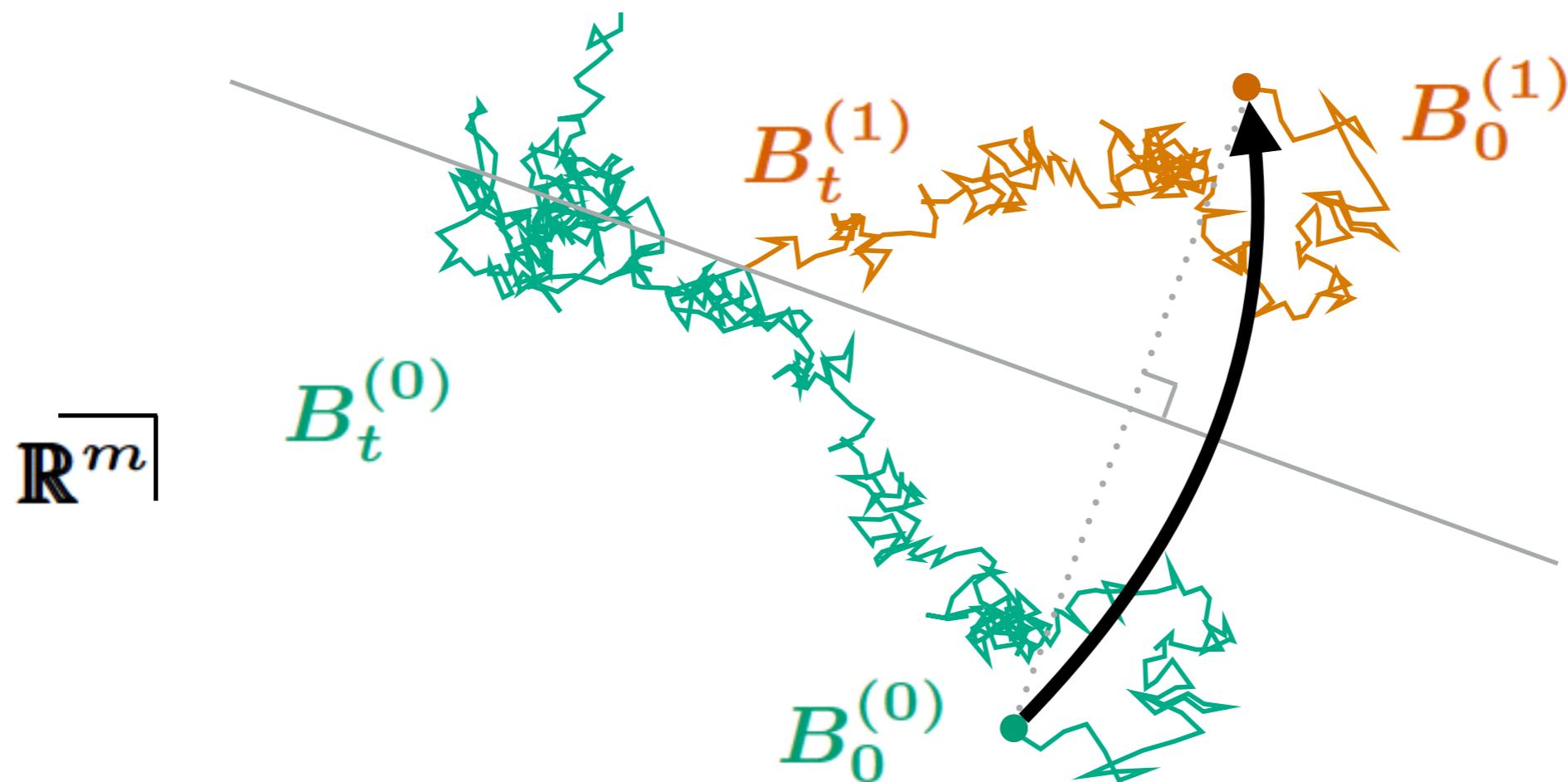


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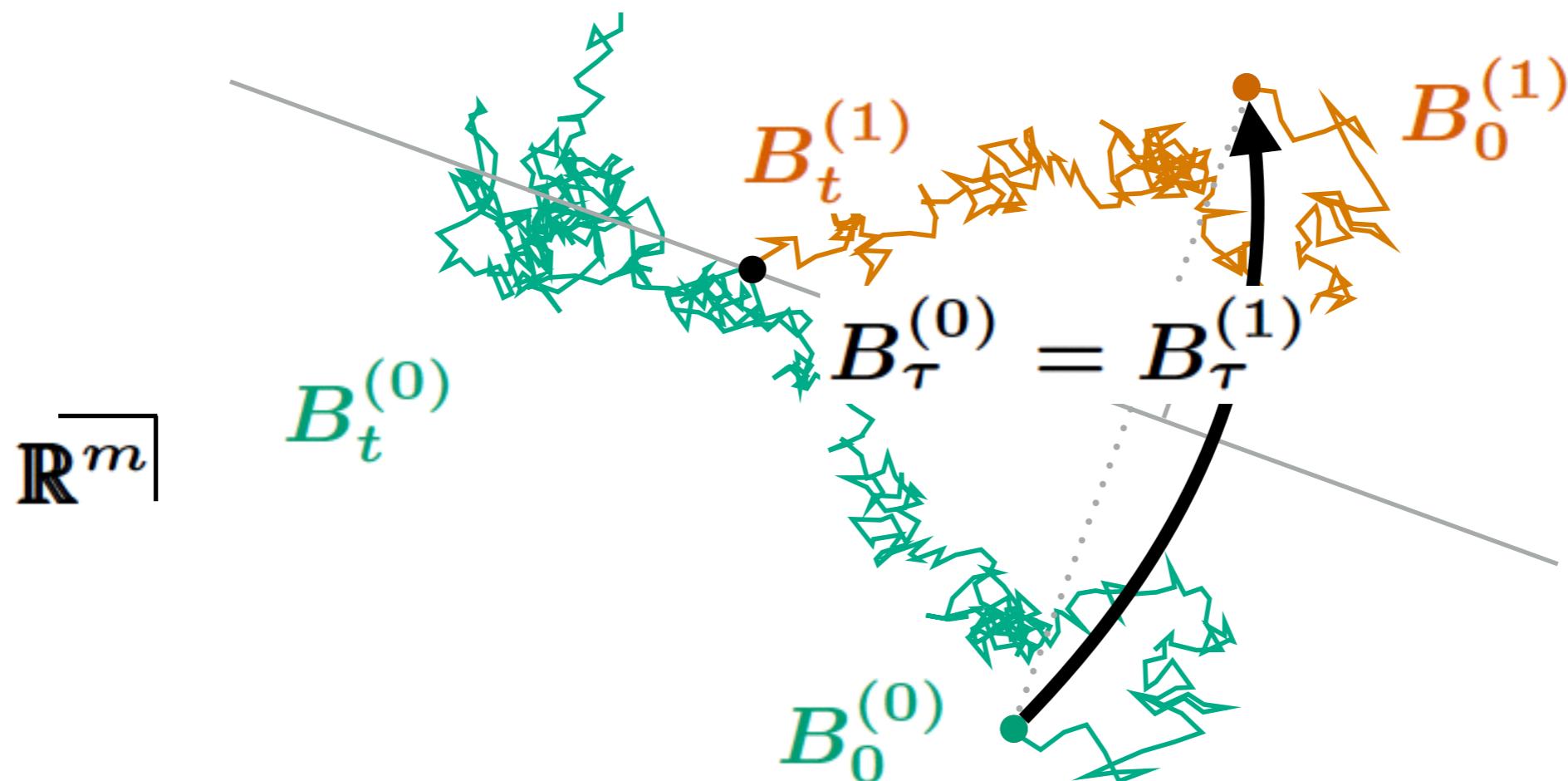


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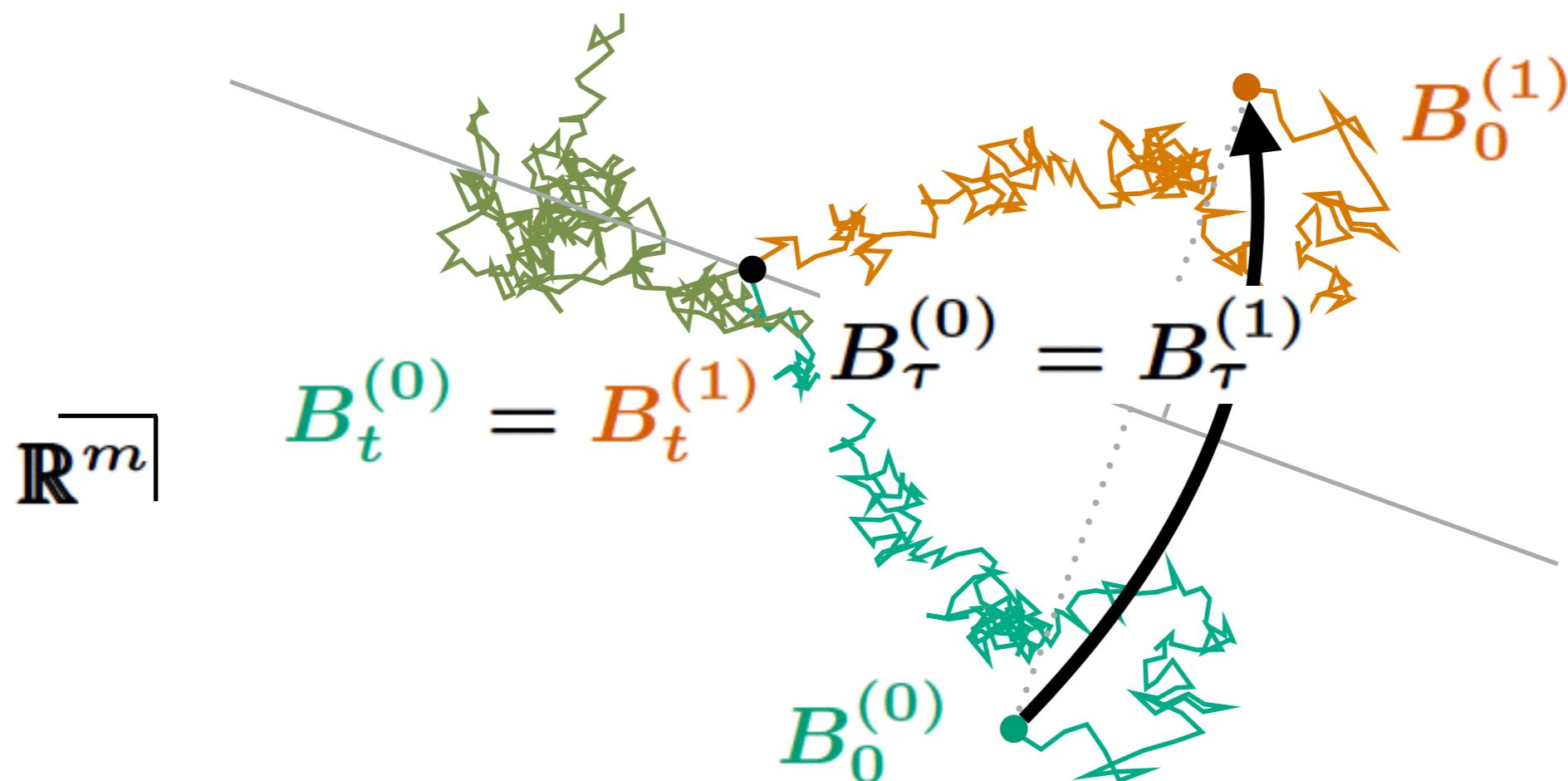


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Coupling of $\textcolor{teal}{dB}_t^{(0)} \in T_{B_t^{(0)}} M$ & $\textcolor{teal}{dB}_t^{(1)} \in T_{B_t^{(1)}} M$
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[Kendall '86 / Cranston '91 / F.-Y. Wang '94,'05 / E.-P. Hsu '03 /
von Renesse '04 / K. '10,'12 / Arnaudon, Coulibaly & Thalmaier '09
/ Neel & Popescu '15+ / ...]

How do we extend?

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Change the definition:

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Change the definition:

From the structure we used for construction
to the characteristic property they satisfies

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$\forall x_0, x_1 \in X \exists (B_t^{(0)}, B_t^{(1)})$: coupling of BMs on X s.t.

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Key idea

- Reduce to construction of a coupling of trans. prob.
- Self-improvement of $\mathbf{BE}(K, \infty)$

[Bakry & Émery '85/Savaré '14]

$$\Rightarrow W_\infty(\delta_x P_t, \delta_y P_t) \leq e^{-Kt} d(x, y)$$

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$\mathbf{W}_2(K, \infty)$

\Updownarrow

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Observe it on Riem. mfd.

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- $d(B_t^{(0)}, B_t^{(1)}) \leq \rho_t^{d(x_0, x_1)}$ ($t < \tau$)

where $\begin{cases} d\rho_t^r = 2\sqrt{2}dW_t - K\rho_t^r dt, \\ \rho_0^r = r \end{cases}$

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Corollary 4 (cf. [K. & Sturm '13])

$$\frac{1}{2} \|\delta_{x_0} P_T - \delta_{x_1} P_T\|_{var} \leq \varphi_T(d(x_0, x_1))$$

(Comparison theorem for total variations)

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 - Brownian motion is defined
 - Bakry-Émery theory is available
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