# Random walks and Brownian motion with drift in cones 

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Workshop "Persistence probabilities and related fields" TU Darmstadt — July 16, 2014

Introduction and motivations

Brownian motion without drift in cones

Brownian motion with drift in cones

Random walks without drift in cones

Random walks with drift in cones

Conclusions

## Random processes (RW and BM) in cones

First exit time from the cone $C$


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Exact and asymptotic expressions for the non-exit probab. $\mathbf{P}_{x}\left[\tau_{C}>n\right](n \rightarrow \infty) \& \mathbf{P}_{x}\left[T_{C}>t\right](t \rightarrow \infty)$

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## Motivations

- Constructing RW and BM conditioned on staying in cones (e.g., Weyl chambers);
- Constructing BM conditioned on starting at the origin of cones (Brownian meander);
- Many processes are naturally in cones (non-colliding processes, eigenvalues of certain random matrices, etc.).


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Exact computation of the non-exit probability


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\mathbf{P}_{x}\left[T_{(0, \infty)}>t\right] & =\mathbf{P}_{0}\left[\min _{u \in[0, t]} B(u)>-x\right] \\
& =\mathbf{P}_{0}[|B(t)|<x] \\
& =\frac{2}{\sqrt{2 \pi t}} \int_{0}^{x} e^{-\frac{y^{2}}{2 t}} \mathrm{~d} y .
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## Heat equation

The function $g(t ; x)=\mathbf{P}_{x}\left[T_{(0, \infty)}>t\right]$ satisfies the heat equation:

$$
\left\{\begin{aligned}
\left(\frac{\partial}{\partial t}-\frac{1}{2} \Delta\right) g(t ; x)=0, & \forall x \in(0, \infty), \quad \forall t \in(0, \infty), \\
g(0 ; x)=1, & \forall x \in(0, \infty), \\
g(t ; 0)=0, & \forall t \in(0, \infty) .
\end{aligned}\right.
$$

## Dimension $d$ : explicit expression for $\mathbf{P}_{\chi}\left[T_{C}>t\right]$

## Heat equation [Doob '55]

For essentially any domain $C$ in any dimension $d, \mathbf{P}_{x}\left[T_{C}>t\right]$ and $p^{C}(t ; x, y)\left(\mathbf{P}_{x}\left[T_{C}>t\right]=\int_{C} p^{C}(t ; x, y) \mathrm{d} y\right)$ satisfy heat equations.

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Dirichlet eigenvalues problem［e．g．，Chavel＇84］


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\left\{\begin{array}{rlrl}
\Delta_{\mathbf{S}^{d-1}} m & =-\lambda m & \text { in } \mathbf{S}^{d-1} \cap C, \\
m & =0 & & \text { in } \partial\left(\mathbf{S}^{d-1} \cap C\right) .
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## Series expansion [DeBlassie '87, Bañuelos \& Smits '97]

$\mathbf{P}_{x}\left[T_{C}>t\right]=\int_{C} p^{C}(t ; x, y) \mathrm{d} y=\sum_{j=1}^{\infty} B_{j}\left(|x|^{2} / t\right) m_{j}(x /|x|)$.

## Asymptotics of the non-exit probability

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One has

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- $\kappa>0$.


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## Dimension 1: Brownian motion with drift $a \in \mathbf{R}$

Density of Brownian motion with drift

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\mathbf{P}_{x}[B(t) \in \mathrm{d} y]=e^{a(y-x)-t a^{2} / 2} \frac{e^{-\frac{(x-y)^{2}}{2 t}}}{\sqrt{2 \pi t}} d y
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Exact expression of the non－exit probability

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\mathbf{P}_{x}\left[T_{(0, \infty)}>t\right]=\int_{0}^{\infty}\left(\mathbf{P}_{x}[B(t) \in \mathrm{d} y]-\mathbf{P}_{x}[B(t) \in-\mathrm{d} y]\right) .
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Asymptotic behavior of the non-exit probability
For all starting point $x>0$, as $t \rightarrow \infty$,

$$
\mathbf{P}_{x}\left[T_{(0, \infty)}>t\right]=(1+o(1)) \begin{cases}\frac{x e^{-a x} e^{-t a^{2} / 2}}{\sqrt{2 \pi} a^{2} t^{3 / 2}} & \text { if } a<0, \\ \frac{\sqrt{2} x}{\sqrt{\pi t}} & \text { if } a=0, \\ 1-e^{-2 a x} & \text { if } a>0 .\end{cases}
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## Dimension 2: simple cases

## Cones in dimension 2



In dimension 2 , any cone is a rotation of $\left\{\rho e^{i \theta}: \rho>0,0<\theta<\beta\right\}$, for some $\beta \in(0,2 \pi]$.

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Half-space $(\beta=\pi)$ with drift $\left(a_{1}, a_{2}\right) \in \mathbf{R}^{2}$
The upper half-plane is a one-dimensional case.

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The upper half-plane is a one-dimensional case.
Quarter plane $\mathbf{R}_{+}^{2}(\beta=\pi / 2)$ with drift $\left(a_{1}, a_{2}\right) \in \mathbf{R}^{2}$

$$
\begin{aligned}
& \mathbf{P}_{\times}\left[T_{\mathbf{R}_{+}^{2}}>t\right] \\
& \quad=\mathbf{P}_{x_{1}}\left[T_{(0, \infty)}\left(B^{(1)}\right)>t\right] \\
& \quad \times \mathbf{P}_{x_{2}}\left[T_{(0, \infty)}\left(B^{(2)}\right)>t\right] \\
& =\kappa h(x) t^{-\alpha} e^{-\gamma t}(1+o(1))
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Dimension $d$ : general case of drift $a \in \mathbf{R}^{d}$

## Exact expression of the non-exit probability

## Using

- the expression of the heat kernel $p^{C}(t ; x, y)$ for the zero drift case,
- Girsanov theorem,
one obtains

$$
\mathbf{P}_{x}\left[T_{C}>t\right]=e^{\langle-a, x\rangle-t|a|^{2} / 2} \int_{C} e^{\langle a, y\rangle} p^{C}(t ; x, y) \mathrm{d} y .
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Decomposition of the asymptotics

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Universal exponential decay [Garbit \& R. '13]
Distance between the drift and the cone:

$$
\gamma=\frac{1}{2} d(a, C)^{2}=\frac{1}{2} \min _{y \in}|a-y|^{2} .
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Dimension $d$ ：general case of drift $a \in \mathbf{R}^{d}$
Cones and polar cones
－C a cone

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## Cones and polar cones

- C a cone
- Polar cone

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C^{\#}=\left\{x \in \mathbf{R}^{d}:\langle x, y\rangle \leq 0, \forall y \in C\right\}
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## Six possible cases

- polar interior drift: $a \in\left(C^{\sharp}\right)^{o}$;
- zero drift: $a=0$;
- interior drift: $a \in C$;
- boundary drift: $a \in \partial C \backslash\{0\}$;
- non-polar exterior drift: $a \in \mathbf{R}^{d} \backslash\left(\bar{C} \cup C^{\sharp}\right)$;
- polar boundary drift: $a \in \partial C^{\sharp} \backslash\{0\}$.

Dimension d: general case of drift $a \in \mathbf{R}^{d}$

## Main remark [Garbit \& R. '13]

- Universal exponential decay $e^{-\gamma t}$ with $\gamma=\frac{1}{2} d(a, C)^{2}$;


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## Main remark［Garbit \＆R．＇13］

－Universal exponential decay $e^{-\gamma t}$ with $\gamma=\frac{1}{2} d(a, C)^{2}$ ；
－Polynomial correction $t^{-\alpha}$ ：depends on
－position of the drift w．r．t．cone \＆polar cone；
－the local geometry of the cone at the points that minimize the distance to the drift．

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- position of the drift w.r.t. cone \& polar cone;
- the local geometry of the cone at the points that minimize the distance to the drift.
Results in dimension 2 [Garbit \& R. '13]



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## Framework and different approaches

## Random walk in $C$

- Let $(S(n))_{n \geq 0}$ be a random walk:

$$
S(n)=x+X(1)+\cdots+X(n)
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where the $X(i)$ are i.i.d.

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Computing exact and asymptotic expressions of the non-exit probability

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\mathbf{P}_{x}\left[\tau_{C}>n\right](n \rightarrow \infty)
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## Many different approaches

- Analytic approach [Fayolle et al. '99];
- Representation theory [Biane et al. '91];
- Comparison with BM [Shimura '84, Garbit '07, Denisov \& Wachtel '11].

Non-exponential decay of the non-exit probability

## Result [Garbit '07]

If $\mathbf{E}[X(i)]=0$ then

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\lim _{n \rightarrow \infty} \mathbf{P}_{x}\left[\tau_{C}>n\right]^{1 / n}=1
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Proof: Push the random walk in $C$.


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& \approx \mathbf{P}_{0}\left[X_{1}=z\right]^{\sqrt{n}} \mathbf{P}_{0}\left[z+B_{t} \in C, \forall t \in[0,1]\right] .
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## More precise asymptotics

Upper and lower bounds [Varopoulos '99]
One has

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c_{1} n^{-p_{1}} \leq \mathbf{P}_{x}\left[\tau_{C}>n\right] \leq c_{2} n^{-p_{1}}
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\mathbf{P}_{x}\left[\tau_{C}>n\right]=\kappa V(x) n^{-p_{1}}(1+o(1))(n \rightarrow \infty)
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where $V(x)$ is a discrete harmonic function equivalent to $u(x)$ as $|x| \rightarrow \infty$.

## More precise asymptotics

## Upper and lower bounds [Varopoulos '99]

One has

$$
c_{1} n^{-p_{1}} \leq \mathbf{P}_{x}\left[\tau_{C}>n\right] \leq c_{2} n^{-p_{1}}
$$

with $p_{1}=\sqrt{\lambda_{1}+(d / 2-1)^{2}}-(d / 2-1)$.
Exact asymptotic behavior [Denisov \& Wachtel '11]
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More [Denisov \& Wachtel '11]

- Local limit theorems;
- Application in enumerative combinatorics;
- Convergence of conditioned RW to conditioned BM.


## Introduction and motivations

## Brownian motion without drift in cones

Brownian motion with drift in cones

Random walks without drift in cones

Random walks with drift in cones

Conclusions

## Exponential decay [Garbit \& R. '13]

- $C \subset \mathbf{R}^{d}(d \geq 2)$ is a convex cone, and $-C^{\sharp}$ is the dual cone;
- $\mu$ is the common law of the $X(i)$.


## Laplace transform

The Laplace transform is $L_{\mu}(x)=\mathbf{E}\left[e^{\langle X(i), x\rangle}\right]$.

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## Walks in half-spaces

The exponential growth depends on the starting point.

## Some ideas of proof

## Exponential change of measure (Girsanov or Cramer)

$$
\mathbf{P}[X(i)=s]=\mu(s) \quad \rightarrow \quad \mathbf{P}^{z}[X(i)=s]=\mu(s) \frac{e^{\langle s, z\rangle}}{L_{\mu}(z)}
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Lower bound
More complicated: locate the minimum of $L_{\mu}(z)$ on the dual cone.

## Summing local limit theorems

## Precise asymptotics in a specific case [Duraj '13]

There is the identity:

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## Results [Duraj '13]

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