

TD1. Brownian motion. Martingales. Stopping times.

Unless stated otherwise, we denote by $B = (B_t)_{t \geq 0}$ a Brownian motion starting from the origin on a probability space $(\Omega, \mathcal{A}, \mathbb{P})$. We also denote by $\mathcal{F}_t := \sigma(B_s, s \leq t)$ the filtration generated by the Brownian motion.

Exercise 1 Prove that (a.s.) Brownian motion is not monotone on any interval.

Exercise 2 We define the *Brownian bridge* as the process $Z_t = B_t - tB_1$ ($0 \leq t \leq 1$).

1. Show that Z is a Gaussian process independent of B_1
2. Compute the mean and covariance function of Z .
3. Is $(Z_t)_{0 \leq t \leq 1}$ a martingale w.r.t $(\mathcal{F}_t)_{t \geq 0}$?
4. Prove that Z has the same law as the process Y defined by

$$Y_t = \begin{cases} (1-t)B_{\frac{t}{1-t}} & (0 \leq t < 1), \\ 0 & (t = 1). \end{cases}$$

Exercise 3 In this exercise, \mathbf{B} is a d -dimensional ($d \in \mathbb{N}$) Brownian motion, that is $\mathbf{B}_t = (B_t^{(1)}, \dots, B_t^{(d)})$, where the $B^{(i)}$'s are independent standard Brownian motions. Let U be a $d \times d$ orthogonal matrix. Prove that the process $(\mathbf{W}_t)_{t \geq 0} = (U\mathbf{B}_t)_{t \geq 0}$ is a d -dimensional Brownian motion.

Exercise 4 (Lévy's characterization of Brownian motion) On a filtered space $(\Omega, \mathcal{F}, (\mathcal{F}_t)_{t \geq 0}, \mathbb{P})$, let $M = (M_t)_{t \geq 0}$ be a continuous square-integrable martingale with $M_0 = 0$ and $\langle M_t \rangle = t$ for all $t \geq 0$. Let F be any twice-differentiable function $F: \mathbb{R}_+ \times \mathbb{R} \rightarrow \mathbb{C}$ with bounded first and second-order derivatives. Define :

$$Z_t = F(t, M_t) - \frac{1}{2} \int_0^t \left(\frac{\partial F}{\partial t} + \frac{1}{2} \frac{\partial^2 F}{\partial x^2} \right) (u, M_u) du, \quad t \geq 0.$$

1. Prove that Z is a martingale.
2. Applying the previous question to $F(t, x) = \exp(i\theta x + \frac{1}{2}\theta^2 t)$, where $\theta \in \mathbb{R}$, prove that M is a Brownian motion.

Exercise 5 The goal of the exercise is to compute (by hand) the bracket of the square-integrable martingale $(M_t)_{t \geq 0} = (B_t^2 - t)_{t \geq 0}$.

1. Compute $\mathbb{E}(B_t^4 | \mathcal{F}_s)$ for all $0 \leq s \leq t$.
2. Let $X_t = \int_0^t B_s^2 ds$. Compute $\mathbb{E}(X_t | \mathcal{F}_s)$ for all $0 \leq s \leq t$.
3. Deduce thereof that $\langle M \rangle_t = 4X_t$.

Exercise 6 For $t \geq 0$, define $A_t = \int_0^t B_s ds$.

1. Justify why A is a well-defined $(\mathcal{F}_t)_{t \geq 0}$ -adapted process.
2. Determine the law of A_t for all $t \geq 0$.
3. Is $(A_t)_{t \geq 0}$ a martingale w.r.t $(\mathcal{F}_t)_{t \geq 0}$?

Exercise 7 For $a > 0$, define $T_a = \inf\{t > 0: B_t \geq a\}$.

1. Show that T_a is a (\mathcal{F}_t) -stopping time.
2. Prove that for all $\lambda \in \mathbb{R}$ and $n \in \mathbb{N}$:

$$\mathbb{E} \left[\exp \left(\lambda B_{T_a \wedge n} - \frac{1}{2} \lambda^2 (T_a \wedge n) \right) \right] = 1.$$

3. Deduce thereof the Laplace transform of T_a :

$$\mathbb{E}[\exp(-uT_a)] = \exp(-a\sqrt{2u}), \quad (u > 0),$$

and show that $\mathbb{P}(T_a < +\infty) = 1$.

TD2. Local martingales. Wiener and Itô integrals.

Unless stated otherwise, we denote by $B = (B_t)_{t \geq 0}$ a Brownian motion starting from the origin on a probability space $(\Omega, \mathcal{A}, \mathbb{P})$. We also denote by $\mathcal{F}_t := \sigma(B_s, s \leq t)$ the filtration generated by the Brownian motion.

Exercise 1 Fix $T \geq 0$. Show that a continuous local martingale $M = (M_t)_{t \in [0, T]}$ is a square-integrable martingale if and only if $M_0 \in L^2$ and $\langle M \rangle_T \in L^1$.

Exercise 2 Let M be a continuous local martingale such that a.s., $\langle M \rangle_\infty = +\infty$. Prove that a.s.,

$$\limsup_{t \rightarrow \infty} M_t = +\infty \quad \text{and} \quad \liminf_{t \rightarrow \infty} M_t = -\infty.$$

Exercise 3 Let

$$Z_t := (1-t) \int_0^t \frac{dB_s}{(1-s)}, \quad 0 \leq t < 1.$$

1. Show that Z is a Gaussian process. Determine its mean and covariance function. How is this process called?
2. Prove that $Z_t \rightarrow 0$ in $L^2(\Omega)$ as $t \rightarrow 1$.
3. Prove that $Z_t \rightarrow 0$ a.s. as $t \rightarrow 1$. *Hint*: prove that for $n \geq 1$ and $\varepsilon > 0$,

$$\mathbb{P}\left(\sup_{2^{-(n+1)} \leq t \leq 2^{-n}} |Z_{1-t}| > \varepsilon\right) \leq \frac{1}{(2^{n-1}\varepsilon^2)}.$$

Exercise 4 Determine the law of the process

$$X_t = e^{-t} \left(X_0 + \int_0^t e^u dB_u \right), \quad t \geq 0,$$

where X_0 is a $\mathcal{N}(0, 1/2)$ random variable independent of $(B_t)_{t \geq 0}$. Show that the process is stationary. How is it called?

Exercise 5 Determine the law of the process

$$X_t = \int_0^{\sqrt{t}} \sqrt{2u} dB_u, \quad t \geq 0.$$

Exercise 6 Let $t \geq 0$ and for $n \in \mathbb{N}$, $0 \leq k \leq n$, define $t_k = tk/n$.

1. Show that

$$B_t^2 = \sum_{k=1}^n 2B_{t_{k-1}}(B_{t_k} - B_{t_{k-1}}) + \sum_{k=1}^n (B_{t_k} - B_{t_{k-1}})^2.$$

2. Deduce thereof that for all $t \geq 0$,

$$B_t^2 - t = \int_0^t 2B_s dB_s, \quad \text{a.s.}$$

3. Retrieve the final result of **Exercise 5** in **TD1**.

Exercise 7 Using the same notation as in the previous exercise :

1. Prove that for all $p > 2$, $\sum_{k=1}^n (B_{t_k} - B_{t_{k-1}})^p \rightarrow 0$ in probability as $n \rightarrow \infty$.
2. Prove that for all continuous function $f: \mathbb{R}_+ \rightarrow \mathbb{R}$, $\sum_{k=1}^n f(B_{t_{k-1}})(B_{t_k} - B_{t_{k-1}})^2 \rightarrow \int_0^t f(B_s) ds$ in probability as $n \rightarrow \infty$.
3. With a similar method to **Exercise 6**, show that $\sin(B_t) = -\frac{1}{2} \int_0^t \sin(B_s) ds + \int_0^t \cos(B_s) dB_s$ a.s.

TD3. (Generalized) Itô integrals. Itô processes. Itô's formula.

Unless stated otherwise, we denote by $B = (B_t)_{t \geq 0}$ a Brownian motion starting from the origin on a probability space (Ω, \mathcal{A}, P) . We also denote by $\mathcal{F}_t := \sigma(B_s, s \leq t)$ the filtration generated by the Brownian motion.

Exercise 1 Check that a process ϕ is progressive if and only if the map $(t, \omega) \mapsto \phi_t(\omega)$ is measurable w.r.t. the progressive σ -field \mathcal{P} defined in the Lecture Notes (Remark 2.2).

Exercise 2 Do the following continuous adapted processes belong to $\mathbb{M}^2(\mathbb{R}^+)$? Or \mathbb{M}^2 ? Or $\mathbb{M}_{\text{LOC}}^2$? (same notation as in the Lecture Notes).

1. $t \in \mathbb{R}^+ \mapsto B_t$;
2. $t \in \mathbb{R}^+ \mapsto \frac{B_t}{1+t^2}$;
3. $t \in \mathbb{R}^+ \mapsto \exp(B_t^2)$.

Exercise 3 Let X be an Itô process started at the origin, that is

$$X_t = \int_0^t \phi_u dB_u + \int_0^t \psi_u du, \quad t \geq 0,$$

where $\phi \in \mathbb{M}_{\text{LOC}}^2$ and $\psi \in \mathbb{M}_{\text{LOC}}^1$. Prove that X is a square-integrable martingale if and only if $\psi \equiv 0$ and $\phi \in \mathbb{M}^2$.

Exercise 4 Let $\alpha: \mathbb{R}^+ \rightarrow \mathbb{R}$ be a continuous function. With the help of the stochastic integration by parts formula, check that the process

$$X_t := \int_0^t \exp\left(\int_s^t \alpha(u) du\right) dB_s, \quad t \geq 0,$$

satisfies the stochastic differential equation $dX_t = \alpha(t)X_t dt + dB_t$.

Exercise 5 With the help of Itô's formula, answer to Question (3) in **Exercise 7, TD2**.

Exercise 6 Let $f: \mathbb{R} \mapsto \mathbb{R}$ be continuously twice-differentiable. Show that the process

$$X_t := f(B_t) - \frac{1}{2} \int_0^t f''(B_s) ds, \quad t \geq 0,$$

is a continuous local martingale. Give a sufficient condition for X to be a martingale.

Exercise 7 Let $n \geq 1$ and x_1, \dots, x_n be distinct points in \mathbb{R} . Let $f: \mathbb{R} \rightarrow \mathbb{R}$ be such that $f \in C^1(\mathbb{R})$ and $f \in C^2(\mathbb{R} \setminus \{x_1, \dots, x_n\})$. We assume that f'' remains bounded in a neighborhood of x_i for all $1 \leq i \leq n$. The goal of the exercise is to prove that Itô's formula is still valid for such a function.

1. Prove that for all $t \geq 0$, the set $\{(\omega, s) \in \Omega \times [0, t]: B_s(\omega) \in \{x_1, \dots, x_n\}\}$ has zero measure w.r.t. $P \otimes ds$, where ds stands for Lebesgue measure.
2. Prove that Itô's formula is valid when we make the additional assumption that f has compact support. *Hint: approximate f by a sequence of continuously twice-differentiable functions.*
3. Conclude in the general case.

Exercise 8 (Tanaka's formula and local time of Brownian motion) For $\varepsilon > 0$, define

$$\phi_\varepsilon(x) = \begin{cases} |x| & (|x| \geq \varepsilon) \\ \frac{1}{2}(\varepsilon + \frac{x^2}{\varepsilon}) & (|x| < \varepsilon). \end{cases}$$

1. With the help of **Exercise 7**, prove that P-a.-s., for all $t \geq 0$,

$$\phi_\varepsilon(B_t) = \int_0^t \phi'_\varepsilon(B_s) dB_s + \frac{1}{2\varepsilon} \text{Leb}(\{0 \leq s \leq t: |B_s| < \varepsilon\}),$$

where « Leb » stands for Lebesgue measure.

2. Check that

$$\int_0^t \phi'_\varepsilon(B_s) \mathbf{1}_{\{|B_s| < \varepsilon\}} dB_s \xrightarrow{\varepsilon \rightarrow 0} 0, \quad \text{in } L^2(\Omega).$$

3. Deduce thereof **Tanaka's formula** : P-a.-s., for all $t \geq 0$,

$$|B_t| = \int_0^t \text{sgn}(B_s) dB_s + L_t,$$

where L_t is the limit in $L^2(\Omega)$ of $\frac{1}{2\varepsilon} \text{Leb}(\{0 \leq s \leq t: |B_s| < \varepsilon\})$, as $\varepsilon \rightarrow 0$, and

$$\text{sgn}(x) = 1 \text{ if } x > 0, \quad \text{sgn}(x) = -1 \text{ if } x \leq 0.$$

4. Prove that the process (L_t) is a.-s. continuous and non-decreasing. This process is called **local time** of the Brownian motion (at the origin).

TD4. Multivariate Itô's formula. Exponential martingales and Girsanov's theorem.

Unless stated otherwise, we denote by $B = (B_t)_{t \geq 0}$ a Brownian motion starting from the origin on a probability space $(\Omega, \mathcal{A}, \mathbb{P})$. We denote by $\mathcal{F}_t := \sigma(B_s, s \leq t)$ the filtration generated by the Brownian motion and write $\mathcal{F}_\infty = \sigma(\cup_{t \geq 0} \mathcal{F}_t)$.

Exercise 1 (Transience and strict local martingales) In this exercise, $B = (B^{(1)}, B^{(2)}, B^{(3)})$ is a three-dimensional Brownian motion starting from $x_0 \in \mathbb{R}^3 \setminus \{0\}$ (recall the definition in **Exercise 3, TD1**). We define $G(x) := 1/\|x\|$ for all $x \in \mathbb{R}^3 \setminus \{0\}$, where $\|\cdot\|$ is the Euclidian norm and

$$T_a = \inf\{t \geq 0 : \|B_t\| = a\}, \quad a \geq 0.$$

1. Check that $\langle B^{(i)}, B^{(j)} \rangle \equiv 0$ whenever $i \neq j$, where $i, j \in \{1, 2, 3\}$.
2. Check that $\Delta G(x) = 0$ for all $x \neq 0$.
3. Using Itô's formula, prove that for all $r > 0$, $\{G(B_{t \wedge T_r})\}_{t \geq 0}$ is a martingale.
4. Assume $0 < r < \|x_0\| < R < \infty$. Show that $T_R < \infty$ a.s. (you may use **Exercise 7 in TD 1**) and

$$\mathbb{P}(T_r < T_R) = \frac{R^{-1} - \|x_0\|^{-1}}{R^{-1} - r^{-1}}.$$

5. Deduce from the previous formula that a.s. $B_t \neq 0$ for all $t \geq 0$.
6. Prove that $\{G(B_t)\}_{t \geq 0}$ is a continuous local martingale.
7. Check that $\{G(B_t)\}_{t \geq 0}$ is a non-negative super-martingale and deduce thereof that $\|B_t\|$ a.s. converges to $+\infty$, as $t \rightarrow \infty$.
8. Prove that $\{G(B_t)\}_{t \geq 0}$ is bounded in L^2 but is not a martingale.

Exercise 2 (Exponential martingales : a simple case) Let $\phi: \mathbb{R}^+ \rightarrow \mathbb{R}$ be a (deterministic) function in $L^2_{\text{loc}}(\mathbb{R}^+)$ and $Z^\phi = (Z_t^\phi)_{t \geq 0}$ the associated Doléans-Dade exponential process. Check that Z^ϕ is a martingale.

Exercise 3 (Exponential martingales : an example) Find a progressive process $X = (X_t)_{t \geq 0}$ such that the process $Z = (Z_t)_{t \geq 0}$ defined by $Z_t = \exp(X_t - B_t^2)$ is a martingale.

Exercise 4 (Change of drift) Let $X = (X_t)_{t \geq 0}$ be an Itô process such that $X_0 = 0$ a.s. and

$$dX_t = b_1(t)dt + \sigma(t)dB_t,$$

where $b_1: \mathbb{R}_+ \rightarrow \mathbb{R}$ is in $L^1_{\text{loc}}(\mathbb{R}^+)$ and $\sigma: \mathbb{R}_+ \rightarrow \mathbb{R}_+^*$ is in $L^2_{\text{loc}}(\mathbb{R}^+)$ (b_1 and σ are both deterministic). Prove that (under suitable assumptions to be specified) there exists a probability measure \mathbb{Q} on $(\Omega, \mathcal{F}_\infty)$ under which X satisfies

$$dX_t = b_2(t)dt + \sigma(t)d\tilde{B}_t,$$

where $b_2: \mathbb{R}_+ \rightarrow \mathbb{R}$ is in $L^1_{\text{loc}}(\mathbb{R}^+)$ and \tilde{B} is a Brownian motion under \mathbb{Q} .

Exercise 5 (Hitting times for Brownian motion with drift) For every $a > 0$ and $b \in \mathbb{R}$, define the following stopping time :

$$T_{a,b} := \inf\{t \geq 0 : B_t + bt = a\}.$$

The goal of the exercise is to determine $\mathbb{P}(T_{a,b} < \infty)$ using the result of **Exercise 7 in TD1** (case $b = 0$) via a change of measure argument.

1. Using an appropriate martingale and Girsanov's theorem, prove that for all $t \geq 0$,

$$\mathbb{P}(T_{a,b} > t) = \mathbb{E}\left[1_{\{T_{a,b} > t\}} \exp\left(bB_t - \frac{1}{2}b^2t\right)\right].$$

2. Deduce thereof

$$P(T_{a,b} \leq t) = E \left[\mathbf{1}_{\{T_a \leq t\}} \exp \left(bB_{t \wedge T_a} - \frac{1}{2} b^2 (t \wedge T_a) \right) \right].$$

3. Conclude that

$$P(T_{a,b} < \infty) = \begin{cases} 1 & (b \geq 0) \\ \exp(2ab) & (b < 0). \end{cases}$$

Exercise 6 (Onsager-Machlup function) Let $h: [0, 1] \rightarrow \mathbb{R}$ be a twice continuously differentiable (and deterministic) function, with $h(0) = 0$. We equip the space of continuous functions $C_0([0, 1], \mathbb{R})$ with the norm $\|f\|_\infty := \max_{x \in [0, 1]} |f(x)|$. Using an appropriate martingale and change-of-measure argument, prove that

$$\frac{P(\|B - h\|_\infty \leq \varepsilon)}{P(\|B\|_\infty \leq \varepsilon)} \xrightarrow{\varepsilon \rightarrow 0} \exp \left(-\frac{1}{2} \int_0^1 h'(s)^2 ds \right).$$

We admit that the denominator in the left-hand side is positive for all $\varepsilon > 0$.

Exercise 7 (Solutions of S.D.E. via Girsanov's theorem) Let $b: \mathbb{R}_+ \times \mathbb{R} \rightarrow \mathbb{R}$ be a bounded measurable function. Assume that there exists $g \in L^2(\mathbb{R}_+)$ such that $|b(t, x)| \leq g(t)$ for all $(t, x) \in \mathbb{R}_+ \times \mathbb{R}$. Using Girsanov's theorem, find a probability measure Q on \mathcal{F}_∞ under which the process defined by

$$B_t - \int_0^t b(s, B_s) ds, \quad t \geq 0,$$

is a Brownian motion.

TD5. Stochastic differential equations. Feynman-Kac formula.

Unless stated otherwise, $(\Omega, \mathcal{A}, \mathbb{P})$ is a probability space equipped with a filtration $(\mathcal{F}_t)_{t \geq 0}$ and $B = (B_t)_{t \geq 0}$ is an $(\mathcal{F}_t)_{t \geq 0}$ -Brownian motion.

Exercise 1 (Invariant distribution for the solution of a s.d.e) Let $V: \mathbb{R} \rightarrow \mathbb{R}$ be a \mathcal{C}^2 function with bounded second derivative. We consider the following s.d.e :

$$dX_t = dB_t - V'(X_t)dt.$$

1. Prove that for any given initial condition $X_0 \in L^2(\Omega, \mathcal{F}_0, \mathbb{P})$, this equation has a unique solution (up to indistinguishability).
2. What is the generator associated to this solution ?
3. Define $\phi(x) = \exp(-V(x))$, which we assume to be in $L^2(\mathbb{R})$. Show that without any loss in generality, we may as well assume that $\nu(dx) := \phi^2(x)dx$ is a probability distribution on \mathbb{R} .
4. Prove that for any $f \in \mathcal{C}_c^2(\mathbb{R})$, $\int (Lf)(x)\nu(dx) = 0$.
5. Assume that X_0 is distributed as ν and prove that for all $t \geq 0$, X_t is distributed as ν too.
6. Give an example for an explicit function V .

Exercise 2 (Feynman-Kac formula in an interval) Let k and f be two continuous functions from $[0, 1]$ to \mathbb{R} . We assume that $f(0) = f(1) = 0$. Let $u: (t, x) \in [0, \infty) \times [0, 1] \rightarrow \mathbb{R}$ be a continuous function that is also in $\mathcal{C}^{1,2}((0, \infty) \times (0, 1), \mathbb{R})$ and solves the following p.d.e :

$$\begin{aligned} & \partial_t u = \frac{1}{2} \partial_x^2 u - ku & (t > 0, 0 < x < 1); \\ \text{(initial condition)} & u(0, x) = f(x) & (0 \leq x \leq 1); \\ \text{(boundary condition)} & u(t, 1) = u(t, 0) = 0 & (t \geq 0). \end{aligned}$$

For all $n \geq 3$, let $I_n := (\frac{1}{n}, 1 - \frac{1}{n})$ and ϕ_n be a \mathcal{C}^∞ compactly supported function such that

$$\phi_n(x) = 0 \text{ if } x \notin (0, 1), \quad \phi_n(x) = 1 \text{ if } x \in I_n.$$

1. Fix $t > 0$ and define for $s \in [0, t]$, $n \geq 3$,

$$\begin{aligned} X_n(s) &= u(t-s, B_s) \phi_n(B_s) \exp\left(-\int_0^s k(B_v) \phi_n(B_v) dv\right), \\ T_n &= \inf\{t \geq 0: B_t \notin I_n\}. \end{aligned}$$

Using Itô's formula, prove that $(X_n(s \wedge T_n))_{s \in [0, t]}$ is a square integrable martingale.

2. Let $T = \inf\{t \geq 0: B_t \notin (0, 1)\}$. We recall that $E_x(T) = x(1-x)$ for $x \in [0, 1]$, where the subscript stands for the starting point of Brownian motion (see Lecture Notes, *Exit time from an interval*). Deduce from the previous question that

$$u(t, x) = E_x\left[f(B_t) \exp\left(-\int_0^t k(B_s) ds\right) \mathbf{1}_{\{t < T\}}\right], \quad \forall x \in (0, 1),$$

and, in the case $k \geq 0$, show that $u(t, x)$ converges to zero uniformly in $x \in (0, 1)$ as $t \rightarrow \infty$.

Exercise 3 (Brownian motion on a circle) Prove that $X_t = (\cos B_t, \sin B_t)$, $t \geq 0$, is the unique solution of the s.d.e :

$$dX_t = -\frac{1}{2} X_t dt + R X_t dB_t, \quad X_0 = (1, 0),$$

where R is (the matrix of) the rotation with angle $\pi/2$.

Exercise 4 (Killed Brownian motion) We consider $u \in \mathcal{C}^{1,2}(\mathbb{R}_+ \times \mathbb{R}, \mathbb{R})$ a bounded solution to the following p.d.e :

$$\begin{aligned} & \partial_t u = \frac{1}{2} \partial_x^2 u - ku \quad (t > 0, x \in \mathbb{R}); \\ \text{(initial condition)} \quad & u(0, x) = f(x) \quad (x \in \mathbb{R}); \end{aligned}$$

where $f, k: \mathbb{R} \rightarrow \mathbb{R}$ are measurable, with f bounded and k non-negative. In this exercise, we provide a representation of this solution in terms of a killed process. To this purpose, we introduce \mathcal{E} an exponential random variable with parameter one that is independent of Brownian motion and set the *killing time*

$$\kappa := \inf \left\{ t \geq 0 : \int_0^t k(B_s) ds \geq \mathcal{E} \right\}.$$

We now define

$$X_t = \begin{cases} B_t & (t < \kappa) \\ \star & (t \geq \kappa). \end{cases}$$

and extend f to $\mathbb{R} \cup \{\star\}$ by setting $f(\star) = 0$. Finally, $\mathcal{G}_t := \sigma(\mathcal{E}, B_s, s \leq t)$.

1. Using the Feynman-Kac formula, show that $u(t, x) = \mathbb{E}_x(f(X_t))$.
2. Show that $X = (X_t)_{t \geq 0}$ is a Markov process.