Connections with PDEs.

- OSDE: definition, Markov property of solutions, associated differential operators.
- 2 Feynman-Kac formula.
- 3 Kolmogorov's backward and forward equations
- Def. Let b(t,x) be a deterministic d-dimensional vector valued function on Lo, \infty) \times IR q and \( \delta(t,x)\) be a deterministic dxr matrix for all \( (t,x) \in \infty \in \infty) \times R^q \text{ Denote by B(t)} \\
  \text{the r-dimensional standard BM.}

A stochastic differential equation with drift b(t,x) and volatility s(t,x) is an equation of the form dX(t) = b(t,X(t))dt + s(t,X(t))dB(t). (E)

A(strong) solution to (E) with initial condition  $x \in \mathbb{R}$  is a stochastic process  $(X(t))_{t > 0}$  with continuous sample paths and with the following properties

(i) X(0) = x a.s. (ii)  $(X(t))_{t > 0}$  is adapted to the following  $(F(t))_{t > 0}$  generated by  $(B(t))_{t > 0}$ 

(iii)  $f | B_i (s, X(s)) | + \delta_{ij}^2(s, X(s)) ds < \infty \text{ a.s. for}$   $| \subseteq i \subseteq d, \quad | \subseteq j \subseteq r, \quad o \subseteq t < \infty$ (iv) for  $t \in [o, T] + f(a, X(u)) da + f(a, X(u)) dB(a)$  | X(t) = X(o) + f(a, X(u)) da + f(a, X(u)) dB(a)as.

Remark: often in applications we need to start at time t from a given point  $x \in \mathbb{R}^d$  and find X: X(t) = x and u  $X(u) = X(t) + \int b(u, X(u)) du + \int b(u, X(u)) db(u), q.s.,$  for u? t.

Some conditions on b(t,x) and  $\delta(t,x)$  are needed to ensure the existence and uniqueness of solutions of (E). Example  $d \times (t) = X(t)dt - X'(t)dB(t), X(0) = 1$ . Let us try to find X(t) in the form f(t, B(t)).  $d \times (t) = d f(t, B(t)) = f_t dt + f_x dB(t) + \frac{1}{2} f_{xx} dt$ = (ft + 2fxx) dt + fx dB(t). f has to salisfy:  $f_{x} = -f^{2}$  and  $f_{\xi} + \frac{1}{2}f_{xx} = f^{3}$  $f_x = -f^2 \Rightarrow f(t,x) = \frac{1}{2C + C(t)}$ Substituting in the second equation gives  $\frac{-c'(t)}{(x+c(t))^2} + \frac{1}{2} \frac{\cancel{x}}{(x+c(t))^3} = \frac{1}{(x+c(t))^3}$  $\Rightarrow c'(t)=0 \Leftrightarrow c(t)=const.$  $f(t,x) = (x+c)^{-1}$  $X(0) = f(0,0) = \frac{1}{c} = 1 \implies C = 1$  $X(t) = f(t, B(t)) = (B(t) + 1)^{-1}$ The problem is that with probability I B(t) hits -1, i.e.  $P(T_{-1} < \infty) = 1$ . Thus, the solution exists only up to the "explosion time" T1.

Typical conditions which prevent explosions and guarantee existence and unqueness of (E) are  $|b(t,x)-b(t,y)|+||\delta(t,x)-\delta(t,y)|| \leq K|x-y|$   $|b(t,x)|, ||\delta(t,x)| \leq K(1+|x|)$ 

for all t > 0,  $x, y \in \mathbb{R}$ . In fact, for d = 1 the conditions can be weakened (for example CIR is included). Here  $\|A\| = \sqrt{\frac{2}{ij-1}} \frac{a_i^2}{ij-1}$ Markov property. Intuition. (d=1) How can one try to simulate K(t),  $0 \le t \le T$ .

Suppose X(0) = x is given. Consider a small increment of time S. Then according to  $(\xi_i)$ Then X((K+1)S) = X(KS) + b(KS, X(KS))S+6(KS, X(KS)) (B(K+1)S)-B(KS)) = X(K)+6(KS, X(KS)) S+ S(KS, X(KS)) V S ZK+1) and Z,..., Zx,... are i.i.d. N(0,1) Then X(nS) = X(T) gives as a simulated value at time T. If we could justify passing to the limit (in some sense) as f 70 then the limiting process would give us a solution to (E) Moreover, our procedure suggests that the limiting process would be memoriless (= Markov process), since given X(KS) we can simulate X(K+1)S), ---, X(nf) without knowing X(o), X(f), --, X(k-1)f). More rigorously, the following theorem holds:

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Theorem 1. Liet 0 \le t \le T and h be a Borel measurable function. Set
            g(t,x) = E^{t,x}h(X(T)).
(take X(t)=x, solve (E) for u\in [t,T], get X(T), and compute the expectation of h(X(T)), repeat for all t\in [0,T], x\in R. Get a deferminish c function g(t,x). Then for t\in [0,T]
      E(h(X(T))/F(t)) = g(t, X(t)),
i.e. solutions to SDEs are Markov processes
    Proof is omitted.
    Heuristics:
Meaning of b(t,x) and b^2(t,x) (d=1)
      E(X(t+s)-X(t)/X(t)=x) \approx
    E\left(b(t, x(t)) + \delta(t, x(t)) \sqrt{s} \, \mathcal{I} \mid x(t) = x\right)
= b(t, x) \cdot \delta \quad \text{lim } \delta^{-1} E(x(t+s) - x(t) \mid x(t) = x)
= b(t, x) \cdot \delta \quad = b(t, x)
= b(t, x)
= b(t, x)
      \approx E((b(4,x(4))\delta+\delta(4,x(4))\sqrt{\delta}Z)^2/x(4)=x)
       = b^{2}(t,x)\delta^{2} + \delta \delta^{2}(t,x);
       \lim_{x \to \infty} \frac{1}{\delta} E((X(t+\delta) - X(t))^2 / X(t) = x) = \delta^2(t, x) = :a(t, x)
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b(t,x) is called the drift coefficient
     a(t,x) is called the diffusion coefficient.
     If u(t,x) is a smooth function then
     E(u(t+8, x(++8)) - u(t, x(t)) / x(t) = x)
     = E ( Ut (1, X(t)) S + Ux (1, X(t)) (X(++8) - X(t)) +
        = \delta \left( \mathcal{U}_{\xi}(t,x) + \beta(t,x) \mathcal{U}_{\chi}(t,x) + \frac{1}{2} \mathcal{U}_{\chi\chi}(t,x) \alpha(t,x) \right)
          + Ō( S)
      lim 5-1 E(u(t+6, x(t+6)) - u(t, x(t)) / x(t) = x)
     S^{*0} = u_{\ell}(\ell, x) + b(\ell, x) u_{x}(\ell, x) + \frac{1}{2} \alpha(\ell, x) u_{xx}(\ell, x)
             =: u_{t}(t,z) + (A_{t}u)(t,z), where
 where 6^{7}(t,x) = \lim_{\delta \to 0} \delta^{-1} E((X(t+\delta) - X(t))^{T} X(t) = x)
a(t,x) = \lim_{\delta \to 0} s^{-1} E((X(t+\delta) - X(t))(X(t+\delta) - X(t))^{T}X(t) - x)
Remark.

When b and 6 do not depend on t, i.e. b = b(x), b = o(x)
    X is called a (time homogeneous, or Ito) diffusion process and
     A (now it does not depend on t) is called the generator of X.
     2) Feynman-Kac formula.
       This formula gives a stochastic representation
         of a solution to a PDE. More precisely,
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Theorem 2 (Feynman-Kac formula) Liet g(H,x) be the solution of  $g_{\ell} + b(\ell, x)g_{x} + \frac{1}{2}\delta^{2}(\ell, x)g_{xx} = r(\ell, x)g$ g(T,x) = h(x)Liet  $(X(u))_{t \leq u \leq T}$  solve (E) with X(t) = x. Then  $g(t,x) = E^{t,x} \left( e^{-\int r(s,X(s))ds} h(X(T)) \right)$ (We assume that some mild integrability conditions are satisfied so that all integrals make sense.) The idea of the proof. For  $0 \le t \le u \le T$  we compute (t is fixed and u is changing)  $d(e^{-\int r(s,X(s))ds}g(u,X(u)))=$ = - r(u, x(u)) e - i r(s, x(s)) ds g(u, x(u)) du  $+e^{-\int r(s,X(s))ds}dq(u,X(u))$  $= e^{-\frac{i}{t}r(s, \chi(s))ds} \left[ \left( -r(u, \chi(u)) g(u, \chi(u)) + \frac{i}{t} \right) \right]$  $+g_{\pm}(u, K(u)) + b(u, K(u))g_{\infty}(u, K(u)) + \frac{1}{2}o^{2}(u, K(u)) \times$ 9xx(u, X(u1)) du + gx(u, X(u1) 6(u, X(u1) dB(u))

Since g solves the PDE, the drift term is O.

Then  $-\int_{-\infty}^{\infty} r(s,X(s)) ds$   $=\int_{-\infty}^{\infty} e^{-s} r(s,X(s)) ds$   $=\int_{-\infty}^{\infty} e^{-s} r(s,X(s)) ds$   $=\int_{-\infty}^{\infty} e^{-s} r(s,X(s)) ds$ Taking wonditional expectation (given X(t)=x) we get  $\int_{-\infty}^{\infty} e^{-s} r(s,X(s)) ds$   $\int_{-\infty}^{\infty} e^{-s} r(s,X(s)) ds$   $\int_{-\infty}^{\infty} e^{-s} r(s,X(s)) ds$ Theorem 3 (Multidimensional Feynman-Kac Formula). Let  $a(t,x) = 66^{T}(t,x)$  and assume that g(t,x) satisfies on  $[0,T) \times \mathbb{R}^{4}$  $\partial_{\xi}g + \sum_{j=1}^{d} b_{j}(t,x) \frac{\partial}{\partial x_{j}}g + \sum_{i=1}^{d} \sum_{j=1}^{d} a_{ij}(t,x) \frac{\partial^{2}g}{\partial x_{i}\partial x_{j}} = r(t,x)g$ with the terminal condition g(T,x) = h(x),  $x \in \mathbb{R}^d$ Then (under integrability conditions)  $g(t,x) = E^{t,x} \left( e^{-\int r(s,X(s))ds} h(X(T)) \right)$ , where (X(u)) solves (E) with  $X(t|=\infty)$  i.e.  $\forall j=1,2,.,d$ .  $\forall k=1$   $\forall$  $X_{j}(t)=\alpha_{j}, j=1,2,...,d$ ;  $t \in u \in T$ .

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Example: (Heston stochastic volatility model; d=2)
Suppose that under P the stock price follows
    dS(t) = rS(t) dt + V(t) S(t) dB, (t), where
     V(t) is a stochastic process and \sim dV(t) = (a - bV(t)) dt + <math>\sigma VV(t) dB_2(t),
 a, b, 6 > 0 and d[B1, B2](t) = pdt, -1<p<1.
• Find the corresponding generator \mathcal{A}
• What does the FK formula say about the
Solution of \frac{\partial g}{\partial t} + \mathcal{A}g = rg; g(T, x, v) = h(x, v)?
It is easy to find the drift b(t, x, v) = \begin{pmatrix} rx \\ a-bv \end{pmatrix}.
 There are 2 ways to find ||a_{ij}(t,x,v)||.

I. Find \delta(t,x,v) and compute \delta\delta^{T}(t,x,v)

For this we have to "decorrelate" our BM
  dB_1(t) = d\widetilde{W}_1(t)
    d\tilde{B}_{2}(t) = \int d\tilde{W}_{1}(t) + \sqrt{1-\int^{2}} d\tilde{W}_{2}(t), where (\tilde{W}_{1}(t), \tilde{W}_{2}(t)) is a standard 2-dimensional BM
    dS(t) = rS(t) dt + VV(t) S(t) dW_i(t)
  dV(t) = (a - b V(t))dt + \sigma VV(t) ( f dW, (t) + V (-p^2 dW_2(t))
    6(t,x,v) = \left\| \nabla v x \right\|_{1-\rho^{2}} 6 \left\| v \right\|_{1-\rho^{2}}
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By the  $\mp K$  formula  $g(t, x, v) = E^{t,x,v} h(S(T)|V(T))$ represents the solution to 3+ Ag = 0 with the terminal condition g(T,x,v) = h(z,v). 3) Kolmogorov backward and forward equations Main point: we have an SDE (E) and its solution X such that X(t) = x. For a given T X(T) is a random variable, whose distribution depends on parameters of (E) and also on t, x. • X(T) has a density denoted by P(t,x;T,y). Here t,x,T are fixed parameters, and to get the density of X(T) you have to consider it as a function of y Question: how to find this density? · Variables (x,t) are called "backward variables" as they correspond to
the starting point of the process X: X(t)=x.

Variables (T, y) are called "forward
variables" as y is the "location" of the
process at a future time T.

(X(u)) t = u = T is a Markov process, and p(t,x; T;y) is its transition probability P(X(T) = B / X(t) = 21) =  $\int P(t,x;T,y)dy$ ,  $\forall B \in O3$ .

Remark. When the coefficients 6 and 6 do not depend on t, that is when b = b(x) and  $\delta = \delta(x)$ then p is a function of (T-t), x, y (as for BM). All in all p(t,x;T,y) has 2 pairs of variables (t,x) -backward and (T,y) - forward. • Kolmogorov backward equation is
the PDE to which p(t,x;T,y) is a solution (with some special terminal data) when T, y are treated as fixed parameters and t, x as variables. · Kolmogorov. forward equation is the DDE to which p(t,x;T,y) is a solution (with some special initial data) when x, t are treated as fixed parameters ant T, y as variables. In particular, the density of X(T) satisfies the forward equation in variables Example (heat equation)  $\frac{\partial g}{\partial t} + \frac{1}{2} \frac{\partial^2 g}{\partial x^2} = 0 \; ; \; g(x, T) = h(x)$  (3)

 $\frac{\partial x \, \alpha m p \, \ell}{\partial t} \cdot (m \, \alpha t) = \frac{\partial^2 g}{\partial x^2} = 0 \; ; \; g(x, T) = h(x) \; (3)$   $\frac{\partial x}{\partial t} + \frac{1}{2} \frac{\partial^2 g}{\partial x^2} = 0 \; ; \; g(x, T) = h(x) \; (3)$   $d = 0 \; ; \; \alpha = 1 \quad \Longrightarrow \quad \text{the corresponding SDE is}$   $d \times (u) = d \cdot B(u) \; ; \; \times (t) = x$   $Thus \quad \times (u) = x + B(u) - B(t) \; ; \; t \in u \in T$   $Generator \qquad \mathcal{A} = \frac{7^2}{\partial x^2} \; .$ 

 $g(t,x) = E^{t,x}h(X(T)) - Solution + (3)$ 

$$g(t,x) = E^{t,x} h\left(x+B(T)-B(t)\right)$$
Since  $B(T)-B(t) = NN(0, T-t)$ , we can compute  $B(T)-B(t) \stackrel{d}{=} VT-t \stackrel{d}{=} Z$ 

$$(4) \quad g(t,x) = \int h\left(x+VT-t \stackrel{d}{=} z\right) \frac{1}{2\pi} e^{-\frac{3^2}{2}} dz$$
Liook at it now from the perspective of  $p(t,x;T,y)$ 

$$g(t,x) = E^{t,x} h\left(X(T)\right) = \frac{\pi}{2}$$

(5) 
$$\int h(y) p(t,x;T,y) dy$$
• If  $h(x) = 1_B(x)$  for some set  $B$  then
$$g(t,x) = \int p(t,x;T,y) dy = P\left(X(T)EB/X(t)-x\right)$$
• Comparing  $(4) \ 2 \ (5) \ (Settiny \ y=x+VT-t \ 2 \ in \ (4))$ 
we get that
$$p(t,x;T,y) = \frac{1}{\sqrt{(2\pi)(T-t)}} e^{-\frac{(x-y)^2}{2(T-t)}}$$
- the transition probability density of  $BM$ ;
$$p(t,x;T;y) dy \quad \text{is the probability that}$$
the  $BM$  that started at  $x$  at time  $t$  will be in  $(y,y+dy)$  at time  $T$ .

(d=1) Theorem. Let X solve (E) on [t,T] and X(t) = x. Let  $p(t,x;T;y) = \lim_{|B| \to 0} P(X(T) \in B \mid X(t) = x)$ (18) is the Lebesgue measure of set  $B \in \mathcal{B}$ )
Then for  $x \in \mathbb{R}^q$ ,  $0 \le t \le T$ (6) of + Ap=0 with the terminal condition (in variables t, >c)  $p(T, x; T, y) = \delta_y(x)$ . The latter means that  $\forall f \in G(R)$  $\lim_{t \uparrow T} \int f(x) p(t,x;T,y) dx = f(y), or$ equivalently, that for every BEB  $\lim_{t \uparrow T} \int_{B} p(t,x;T,y) dx = 1_{B}(y)$ (6) is Kolmojosov backward equation, A u given by (2), p.5) Theorem. (Kolmagorov forward equation) Define  $A_{T}^{*}f(T,y) = -\frac{2}{2y}\left(b(T,y)f(T,y)\right)$ + 2 3/2 (02(T,y) f(T,y)) (adjoint operator) Then p(t,x;T,y) satisfies for T>t,  $x\in\mathbb{R}^d$ 

Then the backward equation: 
$$\frac{2p}{2t} + \frac{1}{2}\Delta_{x}p = 0$$
,  $0 \le t \le T$ ,  $0 \le t \le T$ .

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