Brownian Mohion (BM) procey:

$$\frac{\Delta \lambda}{h-\Delta x} = \frac{\Delta \lambda}{h}$$

X(t): position of particle at time t.

$$X(t) = \Delta u \left(X_1 + X_2 + \cdots + X_{\lfloor \frac{t}{\Delta t} \rfloor} \right)$$

Where [.]: greatest integes less than a youl to the number of [4.4]=4

X:3 are indep.

$$P(X_i = 1) = P(X_i = -1) = \frac{1}{2}$$

$$E(x_i) = 0 \quad \forall (x_i) = E(x_i^2) = 1$$

$$E(X(t)) = O(t/\Delta t)$$

$$V(X(t)) = (\Delta x)^{2} \sum_{i=1}^{n} V(X_{i})$$

$$= \left(\Delta_{\lambda} \right)^{2} \left[\frac{t}{\Delta t} \right]$$

let On no, stro

(ii) Sy we let
$$\Delta x = \sqrt{\Delta t}$$
 , $\sqrt{200}$

as $\Delta t \rightarrow 0$

$$E(X(t)) = 0$$

$$V(X(t)) \rightarrow \sqrt{2}t$$

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Dyth ASP [X4], t== 1 BM proces 4
            (i) X(0)=0 (ii) [X(t), t>=1 her stationary indep. increment
           (iii) \tag{1} \tag{1} \tag{1} \tag{1} \tag{1} \tag{1} \tag{1}
           J 0=1 Standard BM/Viener process
(X(+))BM , then W(t) = X(t) ~ N(=,t) SBM/Winner process
      → W(t)~N(=,t)
                   denvity f_{+}(x) = \frac{1}{\sqrt{2\pi r} + e} e^{-x/2t}
      Note that
          V(t_1) = x_1, --, V(t_n) = x_n = W(t_1) = x_1, V(t_2) - V(t_1) = x_2 - x_1
                                                            1--, W(t,)-W(tn-1)=2m-un-1
      Also V(t_1), V(t_2) - V(t_1) = - V(t_n) - W(t_{n-1}) are
                        indep and has stationers heremarks

\frac{W(t_k) - W(t_{k-1}) \stackrel{d}{=} W(t_k - t_{k-1})}{\sim N(0, t_k - t_{k-1})}.

       Joint density of W(t,), - + W(to) is
  f(x_1, y_1, y_2) = f_t(x_1) f_{t_2-t_1}(x_2-x_1) - f_{t_2-t_{1-1}}(x_1-x_{1-1})
       =\frac{\exp\left\{-\frac{1}{2}\left[\frac{\gamma_{1}^{2}}{t_{1}}+\frac{(\gamma_{2}-\gamma_{1})^{2}}{t_{2}-t_{1}}+-+\frac{(\gamma_{n}-\gamma_{n-1})^{2}}{t_{n}-t_{n-1}}\right]\right\}}{\left(2\pi\right)^{n/2}\left[t_{1}\left(t_{2}-t_{1}\right)--\left(t_{n}-t_{n-1}\right)\right]^{\gamma_{2}}}
     Conditional (W(s)) W(t)=B), s<t
            denil P (2/10) - f.(2) d, (B-x)
```

 $= k_1^{\vee} \exp \left\{ -\frac{\chi^2}{25} - \frac{(B-\chi)^2}{2(t-5)^2} \right\}$ $= k_{2} \exp \left\{-n^{2}\left(\frac{1}{2s} + \frac{1}{2(t-s)}\right) + \frac{Rn}{t-s}\right\}$ = $k_2 \exp \left\{ -\frac{t}{25(t-c)} \left(x^2 - \frac{2sB}{t} x \right) \right\}$ = $k_3 \exp \left\{-\frac{(\chi - Bs/t)^2}{2s(t-s)/L}\right\}$ For S<t K1, K2, K2 mdg-1n [W(s) | W(t)=B) ~ N(\frac{5}{t}B, \frac{5(t-5)}{t}) ~ E(W(s)|W(t)=B) V(W(s)|W(t)=R)Example: In a sicycle race both two competitors, let Y(t): the ant of time (in xcs) by which the racer that started in the mide position is ahead When loot ! If the sace has been completed, and suppose that (Y(t)) sits, can be effectively modeled a BM proces with variance parameter of (a) If the mide oracer is leading by o sec's at the midpoint of the signer, what is the prob that She is the Winner? Y(t)~ N(0, 52t) Sel P(Y(1) >0) Y(\frac{1}{2}) =0)

1/2/ 1/2/ - 1 (< / - T/2 / $= P(Z > -1) = |-P(Z \le -1) = |- \not D(-1)$ = \$(1) = 0.8413 -x-W(t) in MG. ? E(W(t) | W(m), osuss) = E(W(t)-W(s)+W(s)/W(W),05455) = E(W(t)-W(s)|W(u), osuss) + E(W(s)|W(u), osuss)= E(W(t) - W(s)) + W(s)by independed incurred W(t)-17(=,t) $= 0 + \mathcal{V}(s) = \mathcal{V}(s)$

W(t) MG.

Martingale Stopping that An important property of MG X(t) is that if you continually obsorre the process and stop at some time To then, subject to some techniquel Condition E(Y(T)) = E(Y(=))

T - stopping time for MG. expected value of the stopped MG is equal to ity lixed time expectation,

Eg. led T= min St: W(t) = 2-4t7, i.e. oT is the

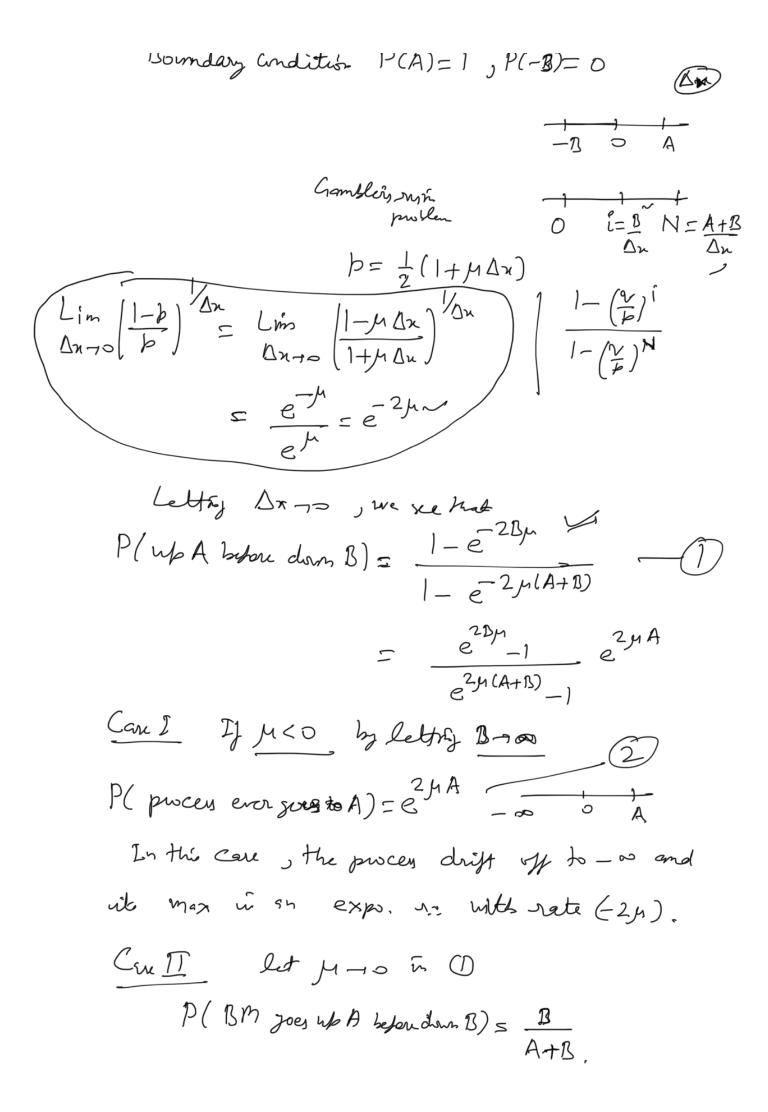
that time that SBM hits the line 2-4t. E(T)=? Sed Using MG stopping thin E(W(T)) = E(W6)) = 0 $V(T) = 2-4T \Rightarrow E(V(T)) = 2-4 E(T)$ コ 2-4 E(T)=0 コ E(T)= 12 Os, let Y(t) = W2(t) -t Ex, Y(t) ma? E(Y(t)) = ?Geometric BM Y(t) BM drift arely for, van-parameter o2 Ylt1~ N(μt, σ2t), $X(t) = e^{Y(t)}$ {X(t), t >0} hermetic Bor. Fer S<t E(X(t) | X(u), osuss) = E(e Y(t) | Y(u), osuss) = E(e >(s) + Y(t) - Y(s) / Y(u), osuss) = e Y(s) E(e Y(t)-Y(s) | Y(4), 0 = uss) $= X(s) E(e^{Y(t)-Y(s)})$ | indep. incuments $= X(s) + (t-s)\sqrt{2}$ = X(s) eStationary incuments

```
N(\mu(t-s), (t-s)\sigma^{2})
W \sim N(i,i)
E(e^{qW}) = e^{aE(w) + \frac{1}{2}a^{2}Vax(w)}
  = X(s) e (t-s)(\(\mu+\G^2/2\)
     => E(X(t)/X(u), o (u < s) = X(s) e (t-s)(4+02/2)
        Geo. BM is useful in modelis, of stock pieces over time
    When you feel the ! age changes are IID.
    eg Let Xn: price of some stock at time n.
    It might be reasoned to suppose that
     \frac{X_n}{X_{n-1}}, n \ge 1, are II. D.
           Led Y_n = \frac{X_n}{X_{n-1}} \Rightarrow X_n = Y_n X_{n-1}
                                        = 1/2 Yny Xn-2
                                        = /n /n - - / X
          = \log X_n = \sum_{i=1}^{n} \log(X_i) + \log(X_0)
        log(/;),iz), IJD, [lg(Xn)) will , when
      Switzely normalized, approx. BM with a drift, so.
       elg Xn = Xn, (Xs) approx. Geo. BM.
X(t) BM with dryft weg in .
                            X(t)~ N(µt,t)
```

11/L1 L1/ 1.

×(t)= b(t)+4+ BM also be dymed as a limit of random walks (DF) (D+) X(t): position al timet X; = S | it step in the direction | 1-p p Xis inday. X(t) = Dn (X,+--+ X(t/Dt]) $E(X(t)) = \Delta x \left(\frac{t}{\Delta t}\right) (2b-1)$ E(x;)=1.p+(1)(1-p) $V(X_{i}) = E(X_{i}^{2}) - (E(X_{i}))^{2}$ $= 1 - (2b-1)^{2}$ $V(X(t)) = (\Delta x)^2 \left[\frac{t}{\Delta t}\right] \left(1 - (2p-1)^2\right)$ If we let $\Delta x = \sqrt{\Delta t}$ $b = \frac{1}{2}(1 + \mu \sqrt{\Delta t})$ and let 10 $E(X(t)) \rightarrow \mu t$ $V(\chi(t)) \rightarrow t$ Probability that the proces will hit A before -B; A, B>

Let P(a) = P(X(t)) hits A before -B|X(a)=0, -B<0<A where P(x) in the prob. that process will hit A before B given that we are now at x, $\frac{1}{x-B}$ in x+A



In general
$$P(x) = \frac{1 - e^{-2\mu(x+B)}}{1 - e^{-2\mu(A+B)}}$$

Example (Exercising a Stock Options)

Suppose we have the option of buying, at some time in the Jutine, one unit of a stock at a fixed price A, indep. I current marked price of the stock in taken to be 0, and we suppose that it change in accordance with a BM having a negative drift walfright -d, where d > 0. The question is, when, if ever, should we exercise our option?

Snel policy excervix the option New market price is x $\frac{d}{dx} = \frac{dx}{dx} = \frac{dx}{dx$

 $J_{1} = -d < 0 \quad , d > 0$ $Furm (2) \qquad P(x) = e^{-2dx}$

Optimal value of x is one max. (x-A) = =f(x)

$$f'(n) = (x-A) e^{-2dx}(-2d) + e^{-2dn} = 0$$

 $\Rightarrow x = A + \frac{1}{2d}$

 $f'(\kappa)$ $\chi_{-\Delta\perp}$ >0

 $\int x = A + \frac{1}{2d} /$ eg 9 A=100) d=2 $x = 100 + \frac{1}{4} = 100,25$ - × *-*Pricing Stock Option: example in option pricing? Gmt v v at t is vedt time O'value preses value Option share of stock at a future him at a I'ved paice. 200 (200 e~) ~ 50 (50 e ~ 1) time o price tin 1 proce Option? by y of stock cost 150 per share
(me oprice) C = ? unit cost of an option We will show unless $C = \frac{50}{1}$, there will be a Combination of purchases that will always remed ma +ve jan.

```
Suppose time O, we
            Sby 2 mit of stock
                                       sell means - n
   Value of our holding at time !
        Value = $200x + 50y = 3/prix ú 200

Sox = 5/prix ú 50
    let we chow y st.
             200x + 50y= 50x = \y=-3x
                           the value of holding = 50n
only option cost a thot does

treat in an arbitrage in

the sy 3c < So

The sy 3c < So
                   A sure win betty scheme in called
                              Gh artidrege
               C=20 (unit cost per option)
             \gamma = -3
                                      2=-32
         indselly cost ns = 100-60=40
```

Value of holding at the 1 (1200, 450)

surenteed profil = 50-403 10 is attained

(2) C=15

x=-1, y=3

instal sans 100 - 45 = 55

Value of helding at time 1 in = - 50

Suranteed profit= \$5-50 = S

Arbitrage thm: expt. whose set of possible ontromes S= {1,2,--,m}.

n wagers

and se is het on wager i, then return I Tri(j) in

carned sy the ordani Jexpt- sig jf = S={12-m} [+ [1,2,--n]

A; (1) - return for for mit bet on Wegeri.

Betty Scheme ?= (3,1-,20)

Outcome of exp! is j, then return how = = \(\int 2; \(\mathcal{J}(j) \)

3 p=(p,-pm) cm S=S1,-,m) under which

each wager has expected return O, or else there

is a betty, scheme that surantees a positive win.

Arbitrage the: Eartly one of the sellowing is true:

Either

(i)] a p= (b1,-, bm) toward \(\subseteq \pi_{\infty} \pi_{\infty} \lambda \lambda \right) =0

(ii) \exists a betting scheme $y = (y_1, y_n)$ Les Which $\frac{m}{2}$ $y_1 = (y_1, y_n)$ Les Which $\frac{m}{2}$ $y_2 = (y_1, y_n)$ Les Which $\frac{m}{2}$ $y_1 = (y_1, y_n)$ Les Which $\frac{m}{2}$ $y_2 = (y_1, y_n)$ Les Which $\frac{m}{2}$ $y_1 = (y_1, y_n)$ Les Which $\frac{m}{2}$ $y_2 = (y_1, y_n)$ Les Which $\frac{m}{2}$ $y_1 = (y_1, y_n)$ Les Which $\frac{m}{2}$ $y_2 = (y_1, y_n)$ Les Which $\frac{m}{2}$ $y_1 = (y_1, y_n)$ Les Which $\frac{m}{2}$ $y_2 = (y_1, y_n)$ Les Which $\frac{m}{2}$ $y_1 = (y_1, y_1)$ Les Which $\frac{m}{2}$ Les Wh

Example (coold)

100 - 50

three O time 1

Set no sine in a \$150 per shape possible

two Outromy

Two Outromy

buy/sell shik

buy/sell option

no swe who b = (b, 1-b) E(return) = 0.

oreturns from providence - (200 - 100 - 100 Galaria 71-

1 mos of Duck (50-100=-50 g. --50-1. Sy pros. that price is 200 at sime 1, then E(retur) = 100p - 50(1-p) E(return) =0 = 100=200p+50(1-p) => p==== $(p, 1-p) = (\frac{1}{3}, \frac{2}{3})$ sorvhru veget zæilds an expected return O. return boundering = 50-C & price 6200 one show y ophier J - C ", ", 50 expected return when $\beta = \frac{1}{2}$ is E(return) = (S=-e) X 1 - Cx2 = So-C arbitrez Im only volue of a which there will not be a sure who is C= So/3.

Example 1 The prevent price y a stock in 100. The price ad time I will be either 50,100 0,200. An option to purchase y shares of the stock at time I don't be a price ky cost cy.

(a) If k = 120, show that an arbitrage opportunity

occus in c> 80/3

(b) I) k=80, show that there is not an arbitrage opportunity & 20 5 C 5 40.

P1= Cy= > P2= 80-3c

that lead to a strewin.

Use Arbitrage thing

P prod. meanon on the set of surrows

Wagen $\leq t$ $e^{-dt} \times (t)$ $f = m \times (t)$, $e^{-dt} \times (s)$ $f = m \times (t)$, $e^{-dt} \times (s)$

worth of options at time $t = \{x(t) - k \in \mathcal{G} \mid x(t) \geq k \}$ $0 \quad \text{if } x(t) < k$

present value of worth of option = e^{-xt}(X(t)-k)^t

 $Ep(e^{-xt}(x(t)-k)^{+})=C-2$ $C_{1}=Ep(e^{-xt}(x(t_{1})-k_{1})^{+}), i=1,2,-1N$ By arbitrage time if we can find a pulse measure p on the set y outroms that satisfy (1), then $y \in C_{1}$

the west of an option to purchase one shere at timet at the fixed price to, is given by (2), then no arbitrage is possible. On the attentional, if her side.

P that Salis both () and expelly (2)