

FINANCIAL ENGINEERING / CAL POLY
LECTURE NOTES: HULL CH 11 12
"THE BLACK-SCHOLES ANALYSIS"

①

USE FOR PHOTOCOPIES
WEEK 5

WE'LL SEE THAT THE B/S PRICING EQⁿ FOR
OPTIONS, (WHICH YOU ARE ALREADY FAMILIAR WITH)
IS REALLY THE SOLUTION TO ANOTHER EQUATION.

THE 'OTHER EQⁿ' IS A PARTIAL DIFFERENTIAL
EQUATION (PDE).

THE ORIGINAL B/S PDE WAS FIRST WRITTEN
DOWN IN 1969, BUT IT TOOK A FEW YEARS
TO SOLVE IT, AND THIS SOLUTION WAS
NOT PUBLISHED UNTIL MAY 1973.

Δ §11.1 THE LOGNORMAL PROPERTY OF STOCK PRICES.

ASSUME $\frac{dS}{S} = \mu dt + \sigma dz$

IN CH 10 WE SAW, w/ $G = \ln S$

$$dG = \left(\mu - \frac{1}{2}\sigma^2\right)dt + \sigma \cdot dz$$

$$d(\ln S) = \left(\mu - \frac{1}{2}\sigma^2\right)dt + \sigma \cdot dz$$

SINCE $dz \sim N(0, \sqrt{dt})$

THEN

(11.1) $d(\ln S) = \ln \tilde{S}_T - \ln S_t \sim N\left(\left(\mu - \frac{1}{2}\sigma^2\right)(T-t), \sigma\sqrt{T-t}\right)$

↖ YOU SHOULD FULLY UNDERSTAND WHERE THIS COMES FROM.

WAS CH 11
IS NOW CH 12

(2)

SINCE $\ln S_t$ IS KNOWN NOW, WE CAN WRITE THE DISTRIBUTION FOR $\ln \tilde{S}_T$ AS ^(@TIME t)

$$(11.2) \quad \ln \tilde{S}_T \sim N \left(\underbrace{\ln S_t + \left(\mu - \frac{1}{2}\sigma^2 \right)(T-t)}_{\substack{\uparrow \\ \text{MOVED FROM LHS TO RHS}}}, \sigma \sqrt{T-t} \right)$$



THIS $\ln S_T$ IS DIST^B NORMAL

FACT: ANY VARIABLE WHO'S NATURAL LOGARITHM IS DIST^B NORMAL, IS SAID TO BE DISTRIBUTED LOG-NORMAL.
 i.e. S_T IS DIST^B LOG-NORMAL SINCE THE LOG OF S_T IS DIST^B NORMAL.

EX SIMILAR TO **EX** 11.1

ASSUME $S_t = \$50$, $\mu = .15$, $\sigma = .30/\text{YR}$
 FIND 95% C.I. OF S IN 3 MONTHS ($t = .25$)

$$\text{THUS } \ln S_T \sim N \left(\underbrace{\ln(50) + (.15 - \frac{1}{2}(.3)^2)(.25)}_{\text{MEAN}}, \underbrace{(.3)\sqrt{.25}}_{\text{STND DEV.}} \right)$$

$$\ln S_T \sim N(3.93827, .15)$$

THUS A 95% CONFIDENCE INTERVAL (C.I.) OF $\ln S_T$ WOULD BE

$$3.93827 - 1.96(.15) \leq \ln S_T \leq 3.93827 + 1.96(.15)$$

$$3.64427 \leq \ln S_T \leq 4.23227$$

(3)

SO WE HAVE A 95% C.I. OF $\ln S_T$, BUT
WE WANT A 95% C.I. OF S_T .

SINCE $e^{\ln S_T} = S_T$ WE'LL TAKE LOGS

WE HAVE $3.64427 \leq \ln S_T \leq 4.23227$

RAISE TO e : $e^{3.64427} \leq S_T \leq e^{4.23227}$

$$\underbrace{\$38.25 \leq S_T \leq \$68.87}_{95\% \text{ C.I. OF } S_T}$$



STOCK PRICES ARE DIST^B LOG-NORMAL SINCE $\ln S_T$ IS DIST^B NORMAL.

A LOG-NORMAL RANDOM VARIABLE CANNOT BE NEGATIVE (ZERO IS THE MINIMUM POSSIBLE VALUE)

IF $S_T \sim \text{LOG-NORMAL}$ THEN

$$E[S_T] = S_t e^{\mu(T-t)}$$

AND

$$\text{VAR}(S_T) = S_t^2 e^{2\mu(T-t)} [e^{\sigma^2(T-t)} - 1] \leftarrow \text{UGLY}$$

§ 11.2 THE DISTRIBUTION OF THE RATE OF RETURN.

WE JUST SAW THAT STOCK PRICES ARE DIST^B LOG-NORMAL, BUT HOW ARE RETURNS DISTRIBUTED?

LET'S USE CONTINUOUSLY COMPOUNDED RETURNS.
RECALL FROM BUS-342:

$$F_T = P_t e^{r(T-t)}$$

w/ r = ANNUALIZED CONT. COMP RETURN
IN OUR SITUATION, THE ANALOGY IS.

$$S_T = S_t e^{r(T-t)}$$

SOLVING FOR r GIVES $r = \frac{1}{T-t} \ln\left(\frac{S_T}{S_t}\right)$

CONTIN. COMPOUNDED RATE.

FOCUS ON $\ln\left(\frac{S_T}{S_t}\right)$ FOR NOW:

THIS EQUALS $\ln(S_T) - \ln(S_t)$ WHICH PER
EQⁿ 11.1 (pg. 1) IS DIST^B NORMAL. THUS, PER (11.1)
WE HAVE

$$\ln\left(\frac{S_T}{S_t}\right) \sim N\left(\left(\mu - \frac{1}{2}\sigma^2\right)(T-t), \sigma\sqrt{T-t}\right)$$



Recall
$$r = \underbrace{\frac{1}{T-t}}_{\text{A CONSTANT} = "K"} \cdot \ln\left(\frac{S_T}{S_t}\right)$$

RECALL, FACT: IF $X \sim N(\mu, \sigma)$

THEN $K \cdot X \sim N(K \cdot \mu, K \cdot \sigma)$

w/ $K = \text{CONSTANT}$.

WHY?

COZ IF $E[X] = \mu$

THEN $E[KX] = K \cdot E[X] = K \cdot \mu$

AND

IF $\text{VAR}(X) = \sigma^2$

THEN $\text{VAR}(KX) = K^2 \cdot \text{VAR}(X) = K^2 \sigma^2$

THUS $\text{STDEV}(KX) = \sqrt{K^2 \sigma^2} = K \sigma$

THEREFORE, w/ $\frac{1}{T-t} = "K"$ AND THE DIST^B OF $\ln\left(\frac{S_T}{S_t}\right)$ GIVEN AS NORMAL ON PREVIOUS PAGE, THEN WE HAVE

$$r \sim N\left(\underbrace{\left(\mu - \frac{1}{2}\sigma^2\right)(T-t)}_{\text{"K"}}, \underbrace{\sigma \cdot \sqrt{T-t} \cdot \left(\frac{1}{T-t}\right)}_{\text{"K"}}\right)$$

THUS

$$r \sim N\left(\mu - \frac{1}{2}\sigma^2, \frac{\sigma}{\sqrt{T-t}}\right)$$

(6)

THUS, CONTINUOUSLY COMPOUNDED RETURNS ARE
DIST^B NORMAL w/ MEAN $\mu - \frac{1}{2}\sigma^2$ AND
STND DEV = $\frac{\sigma}{\sqrt{T-t}}$.

THAT IS, THE VOLATILITY OF THE RETURN DIST^B
DECREASES AS WE LOOK FARTHER INTO THE
FUTURE.

i.e. THE VOLATILITY OF THE RETURN DIST^B
FOR 3 YR RETURNS (ASSUMING ANNUALIZED
 σ' OF .30) WOULD BE $\frac{.3}{\sqrt{3}} = .173$, BUT

THE VOLATILITY OF 5 YR RETURNS WOULD BE $\frac{.3}{\sqrt{5}} = .134$

- ⊗ $\left\{ \begin{array}{l} \text{* RETURNS ARE DIST^B NORMAL} \\ \text{* PRICES ~ ~ LOG NORMAL} \\ \text{(i.e. THE LOG OF S IS DIST^B NORMAL)} \end{array} \right.$



DISCUSSION OF EXPECTED RETURN

Q: SO WHAT IS THE EXPECTED RETURN?

μ OR $\mu - \frac{1}{2}\sigma^2$?

MEAN OF CONT. COMP. RETURNS.

RECALL

$$\frac{ds}{s} = \mu \cdot dt + \sigma \cdot dz$$

THIS $\mu \cdot dt$ IS THE EXPECTED PROPORTIONAL CHANGE
IN S IN A PERIOD dt (dt IS VERY SMALL).

THUS, μ IS THE ANNUALIZED EXPECTED RETURN IN \rightarrow

TIME dt EXPRESSED W/ A COMPOUNDING FREQUENCY OF dt . i.e. μ CORRESPONDS TO VERY SHORT PERIODS OF TIME. HOWEVER, PER ITO'S LEMMA APPLIED TO $\ln S_T$ (CHAPTER 10, PG 221), μ IS NOT THE MEAN OF THE CONTINUOUSLY COMPOUNDED RETURN. THE MEAN OF THE C.C. RETURN HAS BEEN SHOWN TO BE $\mu - \frac{1}{2}\sigma^2$ PER YEAR.

EX ASSUME IN "SHORT" PERIODS WE'VE OBSERVED THE FOLLOWING RETURNS

.10, .20, .05, -.20, .15

GIVEN THIS TIME-SERIES, THE EXPECTED VALUE OF NEXT PERIODS RETURN IS THE MEAN OF THESE VALUES.

$$E[r] = \bar{r} = .06$$

SO WE EXPECT $.06 = \text{IRR}$ TO OCCUR IN EVERY PERIOD

AFTER 5 OF THE .06 PERIODS, A \$100/SH STOCK WOULD BE PRICED AT:

$$100(1.06)^5 = \$133.82$$

HOWEVER IF THE SAME SERIES OCCURED AGAIN, THE PRICE AFTER 5 PERIODS WOULD BE

$$100(1.10)(1.20)(1.05)(.80)(1.15) = 127.51$$

THUS THE ACTUAL RETURN PER PERIOD IS LESS THAN 6% (SINCE $\$127.51 < \133.82)

↑
NEED 6%/PERIOD
TO GET TO 133.82

IN THIS CASE, μ IS ANALAGOUS TO THE 6% RATE,
AND $\mu - \frac{1}{2}\sigma^2$ IS ANALAGOUS TO THE RATE/PERIOD
THAT GIVES $\$127.51$.

LET'S FIND THAT RATE:

Q: WHAT r MAKES $\$100$ GROW TO 127.51

$$P = \frac{F}{(1+r)^t}$$

$$100 = \frac{127.51}{(1+r)^5} \Rightarrow r = \left(\frac{127.51}{100} \right)^{1/5} - 1$$

$$= .04981 < .06$$

.06 IS AN ARITHMETIC IRR (ADD UP 5 RETURNS & DIVIDE BY 5)

.04981 IS A GEOMETRIC IRR (COMPUTE BEGINNING & ENDING VALUES, AND FIND RATE/PERIOD THAT WOULD ACCOMPLISH THAT)

• FACT #1

ARITH RATES \geq GEDM RATES

• FACT #2

ARITH RATES = GEDM RATES ONLY IF $\sigma^2_{\text{RATES}} = 0$

eg ASSUME ACTUAL RATES/PERIOD WERE

.06, .06, .06, .06, .06

IN THIS CASE $\text{IRR}^{\text{ARITH}} = \text{IRR}^{\text{GEDM.}}$

$$s^2 = \frac{(10-6)^2 + (20-6)^2 + (5-6)^2 + (-20-6)^2 + (15-6)^2}{5}$$

$$= \frac{16 + (14)^2 + 1 + 26^2 + 11^2}{5}$$

$$= 202$$

$$s^2 = .0202$$

$$s' = .142$$

$$.06 - \frac{1}{2} (.0202)$$

NOTICE THAT THE VARIANCE OF
 $.10, .20, .05, -.20, .15$ IS $.0202$

THAT IS $\sigma^2 = .0202$

THUS

$$\mu - \frac{1}{2}\sigma^2 = .06 - \frac{1}{2}(.0202)$$

$$= .04990$$

↖ VERY SIMILAR TO OUR IRR^{GEDM}
 OF $.04981$

- CONCLUSION: VERY
 IN A ^{dt} SHORT PERIOD OF TIME THE EXPECTED RATE OF
 RETURN IS μ , HOWEVER THE EXPECTED CONTIN.
COMPOUNDED RATE OF RETURN IS $\mu - \frac{1}{2}\sigma^2$

THIS, WHEN WE SAY "EXPECTED RETURN" WE
 NEED TO BE CAREFULL WHAT WE SAY. OUR
 CONVENTION WILL BE THAT "EXPECTED RETURN" WILL
 MEAN μ , NOT $\mu - \frac{1}{2}\sigma^2$.

- Q: WHY DO WE CARE SO MUCH ABOUT $\ln S_T$ AND

$$\ln(S_T/S_t) = \ln S_T - \ln S_t ?$$

ANSWER^{#1}: WE CARE ABOUT $\ln S_T$ 'CUZ WE SHOWED
 IT TO BE DIST^B NORMAL (S_T IS LOG-NORMAL)



ANSWER #2:

WE CARE ABOUT $\ln S_T - \ln S_t$ BECAUSE THIS GIVES THE CONTINUOUSLY COMPOUNDED RETURN OVER THE PERIOD t TO T . (WHICH IS OFTEN NOT EQUAL TO A 1 YEAR SPAN).

WHERE DOES THE IDEA OF $\ln S_T - \ln S_t$ EQUALLING A CONT. COMPOUNDED RETURN COME FROM? IT COMES FROM BUS-342! (OF COURSE)

$$P = F e^{-rt}$$

$$F = P e^{rt}$$

r IS C.C. ^{ANNUAL} RETURN
 t IS THE # OF YRS

$$F/P = e^{rt}$$

TAKE LOGS...

$$\ln(F/P) = rt$$

$$\ln F - \ln P = \underbrace{r \cdot t}_{\substack{\text{ANNUAL C.C. RETURN} \\ \text{YEARS BETWEEN P AND F}}}$$

$r \cdot t$ = CONTIN COMP RETURN FOR THE ENTIRE PERIOD, WHICH IS OFTEN NOT ANNUAL (TYPICALLY DAILY OR MONTHLY)

eg

$$S_t = 52$$

$$S_T = 59$$

$$\Delta t = 2 \text{ MONTHS}$$

$$\ln 59 - \ln 52 = .1263 \leftarrow \text{THE C.C. 2 MONTH RETURN IS } 12.63\%$$

THE ANNUALIZED CONT. COMP RETURN IS:

$$r_{CC}^{ANNUAL} \cdot t_{YEARS} = .1263$$

$$\Rightarrow r_{CC}^{ANN.} = .1263 / 1/6 = .7578 / \text{YR}$$

THUS, C.C. RETURNS ARE COMPUTED VIA LOGS.

§11.3 "ESTIMATING VOLATILITY FROM HISTORICAL DATA"

GIVEN A TIME SERIES OF, SAY, DAILY PRICES
COMPUTE THE C.C. DAILY RETURNS VIA

$$\ln\left(\frac{S_t}{S_{t-1}}\right)$$

ie w/ 500 DAYS OF PRICE DATA, YOU CAN
GENERATE 499 C.C. DAILY RETURNS,

CALL THESE 499 DAILY RETURNS r_i $i=1, \dots, 499$

THE DAILY STND DEV OF RETURNS IS COMPUTED IN
THE TYPICAL MANNER AS

$$S = \sqrt{\frac{1}{498} \sum_{i=1}^{499} (r_i - \bar{r})^2}$$

↑
SAMPLE
STND DEVIATION

w/ \bar{r} = ARITHMETIC
DAILY
MEAN

FROM EQⁿ (11.1) $\ln(S_T/S_t) \sim N\left((\mu - \frac{1}{2}\sigma^2)(T-t), \sigma\sqrt{T-t}\right)$

S IS AN ESTIMATE OF $\sigma\sqrt{T-t}$

(RECALL THAT THE BEST ESTIMATE OF THE
POPULATION VARIANCE IS THE SAMPLE VARIANCE)

ANNUALIZED
↓

THUS THE POPULATION STND DEV, σ , IS BEST
ESTIMATED BY $\hat{\sigma}_{ANN} = \frac{S}{\sqrt{T-t}}$

WE CAN ALSO SPEAK OF HOW PRECISE THIS ESTIMATE OF THE POPULATION STD DEVATION IS.

THAT IS, WE'D LIKE TO KNOW THE "STD DEVATION OF THE ESTIMATE OF THE STD DEVATION" WHICH IS TECHNICALLY REFERED TO AS THE STANDARD ERROR OF THE ESTIMATE.

IT CAN BE SHOWN THAT THE STD ERROR OF $\hat{\sigma}$ IS EQUAL TO $\frac{\hat{\sigma}}{\sqrt{2 \cdot N}}$ w/ $N = \#$ OF RETURNS (499 IN MY EXAMPLE)

[EX]

THIS, IF WE HAVE 500 DAILY PRICES, GIVING 499 DAILY C.C. RETURNS, WITH ARITHMETIC DAILY MEAN RETURN OF, SAY, .0005 AND DAILY SAMPLE STD DEVATION, S , EQUAL TO .0180, THEN WE'D ESTIMATE THE ANNUAL STD DEVATION AS

$$\hat{\sigma}_{ANN} = \frac{S}{\sqrt{\Delta t}} = \frac{.0180}{\sqrt{1/252}} = .2857$$

IT'S BEST TO ASSUME 252 DAYS PER YEAR, NOT 365.

252 = # OF TRADING DAYS PER YEAR.

(se)

THE STANDARD ERROR OF THIS ESTIMATE IS COMPUTED AS

$$S.E. = \frac{\hat{\sigma}}{\sqrt{2n}} = \frac{.2857}{\sqrt{2 \cdot 499}} = .00904$$

THIS WE COULD 95% THAT THE TRUE POPULATION STND DEVIATION IS IN THE RANGE OF

$$\hat{\sigma} - 1.96(se) \leq \sigma_{ANN} \leq \hat{\sigma} + 1.96(se)$$

$$.2857 - 1.96(.00904) \leq \sigma_{ANN} \leq .2857 + 1.96(.00904)$$

$$.2680 \leq \sigma_{ANN} \leq .3034$$

▷

Q: How much data to use?

MORE DATA INCREASES PRECISION, BUT AT THE RISK OF USING OLD AND IRRELEVANT DATA.

OFTENT 180 DAYS OF DAILY DATA IS USED, AND SOMETIMES THE AMT OF HISTORICAL DATA USED IS SET EQUAL TO THE HORIZON IN QUESTION (ie IF USING THE DATA TO PRICE A 3 YR OPTION, THEN USE 3 YRS OF DATA, PREFERABLY DAILY)

▷

STUDENTS:

SEE END OF SECTION 11.3 ON RETURNS ON EX-DIVIDEND DATES.

§11.4 "CONCEPTS UNDERLYING THE B/S DIFF EQ"

B/S COMES FROM THE SOLUTION TO A DIFFERENTIAL EQUATION.

THE DIFF EQⁿ IS CONSTRUCTED VIA A NO ARBITRAGE ARGUMENT.

THE IDEA BEHIND THE CONSTRUCTION IS

THAT A COMBO OF THE DERIVATIVE, f , AND THE STOCK, S , CAN BE MADE WHICH MUST EARN THE RISK-FREE RATE.

NOTICE THAT THE UNCERTAINTY IN BOTH S AND f IS $dz = \epsilon \sqrt{dt}$, HENCE IF WE CAN COMBINE S AND f SUCH THAT THE dz 'S CANCEL OUT, OUR PORTFOLIO OF f AND S WILL BE RISK FREE, AND THUS BY NO-ARB IT MUST EARN THE RISK-FREE RATE.

THIS ARGUMENT WHEN WRITTEN DOWN GIVES A DIFFERENTIAL EQUATION WHICH WHEN SOLVED GIVES THE SOLUTION OF

$$C = S \cdot N(d_1) - K e^{-rt} \cdot N(d_2)$$

IN ORDER TO DERIVE THE B/S SOLUTION WE ASSUME THE FOLLOWING:

- ① S FOLLOWS GBM w/ CONST μ & σ
- ② SHORT SELLING w/ FULL USE OF PROCEEDS IS ALLOWED
- ③ NO FRICTIONS (NO TRX COSTS, NO TAXES, NO INDIVISIBILITIES)
- ④ NO DIVIDENDS OVER THE LIFE OF THE OPTION
- ⑤ NO ARBITRAGE
- ⑥ TRADING IS CONTINUOUS
- ⑦ THE YIELD CURVE IS FLAT.

SEE CH 19 TO RELAX SOME OF THESE ASSUMPTIONS.

§ 11.5 DERIVATION OF B/S DIFF. EQ.

$$(11.8) \quad ds = \mu S dt + \sigma S dz \quad \text{ASSUMED}$$

LET f BE THE PRICE OF A EURO CALL (OR OTHER DERIV THAT DEPENDS ON S AND t). VIA ITO'S LEMMA, CH 10, WE HAVE:

$$(11.9) \quad df = \left(\frac{\partial f}{\partial S} \mu S + \frac{\partial f}{\partial t} + \frac{1}{2} \frac{\partial^2 f}{\partial S^2} \sigma^2 S^2 \right) dt + \frac{\partial f}{\partial S} \sigma S dz$$

NOTE THAT THE UNCERTAINTY IN BOTH S AND f IS DUE ENTIRELY TO dz . THE dz 'S IN THE 2 EQN'S ARE THE SAME dz .

CONSIDER THE FOLLOWING PORTFOLIO CONSISTING OF S AND f :

-1 UNITS OF THE DERIVATIVE

+ $\frac{\partial f}{\partial S}$ SHARES OF STOCK

IE THE PORT IS SHORT 1 DERIVATIVE (ON 1 SHARE OF STOCK) AND LONG $\frac{\partial f}{\partial S}$ SHARES OF STOCK.

LET Π STAND FOR THE VALUE OF THE PORTFOLIO, THUS

$$\Pi = (-1)f + \left(\frac{\partial f}{\partial S} \right) \cdot S$$

THE CHANGE IN PORT VALUE IN TIME dt IS

$$(11.13) \quad d\Pi = (-1)(df) + \left(\frac{\partial f}{\partial S} \right) \cdot (dS)$$

NOW SUB df & dS FROM EQⁿ'S 11.8 AND 11.9 INTO 11.13. THIS GIVES

$$d\pi = (-1) \left\{ \left(\frac{\partial f}{\partial S} \mu S + \frac{\partial f}{\partial t} + \frac{1}{2} \frac{\partial^2 f}{\partial S^2} \sigma^2 S^2 \right) dt + \frac{\partial f}{\partial S} \sigma S dz \right\} + \frac{\partial f}{\partial S} \{ \mu S dt + \sigma S dz \}$$

ALL RISK GOES AWAY!

THE TERMS INVOLVING dz CANCEL OUT (DO YOU SEE WHY WE PICKED -1 UNITS OF f AND $+\frac{\partial f}{\partial S}$ UNITS OF STOCK? YOU SHOULD!)

WE HAVE ONLY TERMS INVOLVING dt . AFTER A SMALL AMT OF COMBINING TERMS WE GET

$$d\pi = \left(-\frac{\partial f}{\partial t} - \frac{1}{2} \frac{\partial^2 f}{\partial S^2} \sigma^2 S^2 \right) dt$$

SINCE THERE IS NO RISK, THIS PORTFOLIO MUST EARN r_f . THUS,

$$d\pi = r_f \cdot \pi \cdot dt \quad \text{w/ } \pi = -f + \frac{\partial f}{\partial S} \cdot S$$

THUS WE HAVE

$$\left(-\frac{\partial f}{\partial t} - \frac{1}{2} \frac{\partial^2 f}{\partial S^2} \sigma^2 S^2 \right) dt = r_f \left(-f + \frac{\partial f}{\partial S} \cdot S \right) dt$$

OR

$$(11.15) \quad \frac{\partial f}{\partial t} + r_f \cdot S \frac{\partial f}{\partial S} + \frac{1}{2} \sigma^2 S^2 \frac{\partial^2 f}{\partial S^2} = r_f \cdot f$$

B/S DIFF EQUATION!

THERE ARE MANY POSSIBLE SOLUTIONS TO THE B/S DIFF EQN. ONE MUST SPECIFY EXACTLY HOW f BEHAVES AS A FUNCTION OF S AND t AT MATURITY IN ORDER TO GET A SPECIFIC SOLUTION. THIS SPECIFICATION OF THE PRICE OF f @ AT THE "BOUNDARIES" OF S AND t IS KNOWN AS "THE BOUNDARY CONDITIONS." DIFFERENT BOUNDARY CONDITIONS GIVE DIFFERENT SOLUTIONS.

FOR EURO CALLS THE BOUNDARY CONDITION IS

$$f = \max(0, S - K) \quad @ \quad t = T$$

W/ THIS BOUNDARY CONDITION, THE SOLUTION TO (11.15) IS

$$C = f = S N(d_1) - K e^{-rt} N(d_2)$$

§ 11.6. "RISK NEUTRAL VALUATION"

RISK NEUTRAL VALUATION IS THE MOST IMPORTANT CONCEPT FOR VALUING (PRICING) DERIVATIVES. WE USED IT IN BINOMIAL OPTION PRICING, AND IT GETS USED AGAIN W/ B/S.

WHY IS IT OK TO ASSUME INVESTORS ARE RISK NEUTRAL WHEN WORKING W/ B/S?

BECAUSE IN THE B/S DIFF EQN THERE ARE NO VARIABLES THAT ARE RELATED TO SYSTEMATIC RISK.

THE ONLY VARIABLES IN THE B/S DIFF EQⁿ ARE t, r, S , AND σ . σ IS NOT REWARDED (VIA AN INCREASE IN $E[R]$ BECAUSE IT IS THE IDIOSYNCRATIC PORTION OF GBM (RECALL THAT σdz HAS MEAN ZERO, THUS INCREASING σ DOES NOT AFFECT $E[\frac{dS}{S}]$).

WE'RE LUCKY THAT μ DOES NOT APPEAR IN THE B/S DIFF EQⁿ. IF IT DID, ^{THEN} WE COULD NOT EMPLOY RISK NEUTRAL VALUATION.

① FACT: IF AN INVESTOR IS RISK NEUTRAL THEN HE/SHE PRICES ALL SECURITIES VIA DISCOUNTING @ r_f (i.e. ALL SECURITIES IN A RISK NEUTRAL WORLD EARN r_f).

SINCE μ DOES NOT EXIST IN THE B/S DIFF EQⁿ THEN WE CAN USE ANY TYPE OF INVESTOR RISK PREFERENCES TO VALUE THE DERIVATIVE. SOME (MOST) INVESTORS ARE RISK AVERSE (REQUIRE $\uparrow E[R]$ AS COMPENSATION FOR \uparrow SYS. RISK), OTHERS MAY BE RISK NEUTRAL. BOTH TYPES OF INVESTORS WILL AGREE ON THE PRICE OF THE DERIVATIVE, f , SINCE SYSTEMATIC RISK PLAYS NO ROLE.

THUS WE COULD USE SOME COMPLICATED RISK PREFERENCE STRUCTURE (ASSOC. w/ A RISK AVERSE INVESTOR) OR WE COULD USE A VERY SIMPLE RISK PREFERENCE STRUCTURE (RISK NEUTRAL) TO FIND THE PRICE OF THE DERIVATIVE.

IT'S MUCH EASIER TO USE 'RISK NEUTRAL VALUATION.'

NOTE: WE DO NOT EVEN REQUIRE THAT A SINGLE PERSON IS RISK NEUTRAL. WE NEED ONLY CONSIDER THAT THIS TYPE OF PERSON COULD EXIST, AND IF HE/SHE DID, THEN WE KNOW THE PRICE OF f HE/SHE WOULD COMPUTE WOULD AGREE w/ THAT COMPUTED (SOMEHOW) BY RISK AVERSE INVESTORS.



HOW TO USE R. NEUTRAL VALUATION w/ B/S :

CONSIDER A DERIVATIVE WITH PAYOFF @ TIME T (@ MATURITY) THAT DEPENDS ON S_T .

WE FIRST COMPUTE THE EXPECTED PRICE OF S @ TIME T USING THE RISK-FREE RATE r_f .

i.e. $E^*[S_T] = S_t e^{r_f(T-t)}$

DO NOT USE μ !

THIS GIVES THE EXPECTED VALUE OF THE DERIVATIVE @ TIME T .

FOR EXAMPLE, w/ A ^{LONG} FORWARD CONTRACT THE PAYOFF @ TIME T IS $S_T - K$

↑
FORWARD PRICE YOU LOCKED IN. (YOU BOUGHT @)

LET f NOW DENOTE THE VALUE OF THE FORWARD (AS IN, HULL CH 3)

THE EXPECTED PAYOFF IS $E^*(S_T - K)$

THE * ON THE E MEANS USE r_f , NOT μ .

THEFORE THE EXPECTED VALUE @ TIME t
(USING R. NEUTRAL VALUATION) IS

$$\begin{aligned} f &= PV^* \cdot E^*(S_T - K) \\ &= e^{-r_f(T-t)} \cdot \{E^*(S_T - K)\} \\ &= e^{-r_f(T-t)} \{E^*(S_T) - K\} \\ &= e^{-r(T-t)} \left\{ S_t e^{r(T-t)} - K \right\} \end{aligned}$$

$$f = S_t - K e^{-r_f(T-t)} \quad \leftarrow \text{AGREE'S w/ EQ}^n (3.6)$$

IS THIS A SOLUTION TO THE DIFF EQⁿ
(11.15)?

LETS SEE (11.15) IS

$$\frac{\partial f}{\partial t} + rS \frac{\partial f}{\partial S} + \frac{1}{2} \sigma^2 S^2 \frac{\partial^2 f}{\partial S^2} = r f$$

COMPUTE DERIVATIVES AND PLUG IN:

$$\frac{\partial f}{\partial t} = -r K e^{-r(T-t)}$$

$$\frac{\partial f}{\partial S} = 1$$

$$\frac{\partial^2 f}{\partial S^2} = 0$$

SUB IN:



$$-r K e^{-r(T-t)} + r \cdot S \cdot (1) + \frac{1}{2} \sigma^2 S^2 (0) = r f$$

$$\cancel{-r K e^{-r(T-t)}} + \cancel{r S} = \cancel{r f}$$

(3.6)
(11.19)

$$\Rightarrow \underbrace{f = S - K e^{-r(T-t)}}$$

THUS OUR ORIGINAL GUESS
OF $f = S - K e^{-r(T-t)}$ DOES SATISFY
THE DIFF EQⁿ, CONFIRMING (AGAIN)
THAT (11.19) IS THE SOLUTION TO
THE DIFF. EQⁿ.

§ 11.7 "B/S PRICING FORMULA'S"

NOW LET'S SEE HOW RISK NEUTRAL
VALUATION IS APPLIED TO EURO CALLS.

THE PAYOFF OF C @ TIME T IS

$$\max(0, S_T - K)$$

THE EXPECTED PAYOFF (USING R. NEUTRAL VALUATION)
IS

$$E^*[\max(0, S_T - K)]$$

IMPORTANT NOTE, THIS IS NOT THE SAME
AS

$$\max(0, E^*(S_T) - K)$$

IF THIS \uparrow WERE TRUE WE'D GET A DIFFERENT
SOLUTION!

AT TIME t
THE PRICE OF THE EURO CALL IS

$$C_t = PV^* \cdot E^* [\max(0, S_T - K)]$$

$$= e^{-r_f(T-t)} \cdot E^* [\max(0, S_T - K)]$$

HOW TO EVALUATE?

WE KNOW, IN A RISK NEUTRAL WORLD (W/ μ REPLACED BY r_f)

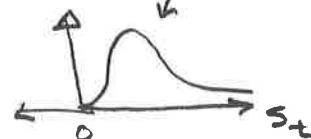
← WAS μ

$$\ln S_T \sim N(\ln S_t + (r - \frac{1}{2}\sigma^2)(T-t), \sigma\sqrt{T-t})$$

$$C_t = e^{-r_f(T-t)} \cdot \int_0^{\infty} \max(0, S_T - K) \cdot \underbrace{g(S_T)}_{\text{pdf of } S_T} \cdot dS_T$$

RECALL "MATH
PRELIMINARIES"
HANDOUT.

{ RECALL S_T IS DIST B }
LOG-NORMAL



THIS IS
ZERO SINCE
CANNOT BE
BROW 0

$$E[X] = \int_{-\infty}^{\infty} x \cdot \text{pdf}(x) dx$$

$$\& E[f(x)] = \int_{-\infty}^{\infty} f(x) \cdot \text{pdf}(x) dx$$

HOW TO EVALUATE THE INTEGRAL?

WE KNOW

$$\int_0^K \max(0, S_T - K) \cdot g(S_T) dS_T = 0$$

SINCE IF S_T IS IN THE RANGE OF 0 TO K THE

PAYOFF IS ZERO, AND THUS ZERO. PDF IS ZERO, AND THE AREA UNDER A CURVE W/ CONSTANT VALUE OF ZERO IS ZERO.

THIS

$$\begin{aligned} \int_0^{\infty} \max(0, S_T - K) \cdot g(S_T) dS_T &= \int_0^K \max(0, S_T - K) \cdot g(S_T) dS_T + \\ &+ \int_K^{\infty} \max(0, S_T - K) \cdot g(S_T) dS_T \\ &= 0 + \int_K^{\infty} \max(0, S_T - K) \cdot g(S_T) dS_T \end{aligned}$$

← PER PREVIOUS PAGE

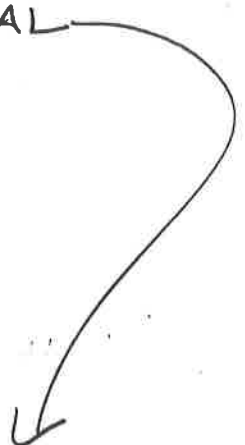
Q: SO WHAT IS THIS EQUAL TO?

A: NOTICE THAT IN THE RANGE OF $K < S_T < \infty$
 $\max(0, S_T - K) = S_T - K$ SO WE CAN WRITE

$$\begin{aligned} &\int_K^{\infty} \max(0, S_T - K) \cdot g(S_T) dS_T \\ &= \int_K^{\infty} (S_T - K) \cdot g(S_T) dS_T \end{aligned}$$

SINCE S_T IS LOG-NORMAL THIS IS AN UGLY PDF.

SEE HULL 4TH EDITION, APPENDIX
11-A FOR A STEP BY STEP EVALUATION
OF THIS INTEGRAL



THE SOLUTION TO THIS INTEGRAL IS
NOT EASY TO OBTAIN, BUT IT IS

$$C = S N(d_1) - K e^{-r(T-t)} N(d_2)$$

$$d_1 = \frac{\ln(S/K) + (r + \frac{1}{2}\sigma^2)(T-t)}{\sigma \sqrt{T-t}}$$

$$d_2 = d_1 - \sigma \sqrt{T-t}$$

$$= \frac{\ln(S/K) + (r - \frac{1}{2}\sigma^2)(T-t)}{\sigma \sqrt{T-t}}$$

SINCE IT CAN BE SHOWN THAT IT IS NEVER OPTIMAL TO EXERCISE AN AMERICAN CALL ON A NON-DIVIDEND PAYING STOCK, IT MUST BE TRUE THAT FOR NON-DIVIDEND PAYING STOCKS, THE B/S EQUATION ALSO HOLDS FOR AN AMERICAN CALL (NOT TRUE OF FX AMER CALLS, ONLY TRUE FOR STOCK OPTION AMER CALLS — SINCE FOREIGN CURRENCIES PAY "DIVIDENDS" IN THE FORM OF INTEREST).

TO VALUE AN AMER. PUT ON A NON-DIV PAYING STOCK B/S DOES NOT WORK (SINCE IT IS SOMETIMES OPTIMAL TO EXERCISE THE OPTION BEFORE MATURITY). IN THIS CASE THE BINOMIAL METHOD IS USED.

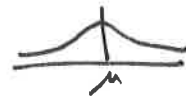
IF DIVIDENDS ARE PAID CONTINUALLY (IN A SMOOTH STREAM, "EVERY SECOND") THEN B/S CAN BE MODIFIED AND APPLIED TO EURO PUTS & CALLS. SEE ED'S (12.4) & (12.5).

IF DIVIDENDS ARE "Lumpy" (i.e. EVERY QUARTER) THEN S IN B/S IS EVERYWHERE REPLACED BY $S - PV(DIV'S)$ AND B/S CAN BE USED. SEE SECTION 11.12 OF HULL.

FOR AMERICAN OPTIONS — SEE SECTION 11.12 OF HULL. \Rightarrow EARLY EXERCISE, IF IT OCCURS, WILL ONLY OCCUR JUST PRE TO THE LAST LUMPY DIVIDEND.

§11.8 CUMULATIVE NORMAL DIST^B

RECALL FROM "MATH PRELIM" HANDOUT THE PDF OF THE NORMAL LOOKS LIKE



THE AREA UNDER THE CURVE TO THE LEFT OF ANY POINT ON THE X-AXIS IS $\int_{-\infty}^x \text{pdf}(x) dx$

THIS CAN BE PLOTTED, THE ABOVE INTEGRAL CAN NEVER FALL BELOW ZERO OR RISE ABOVE 1, THAT IS,

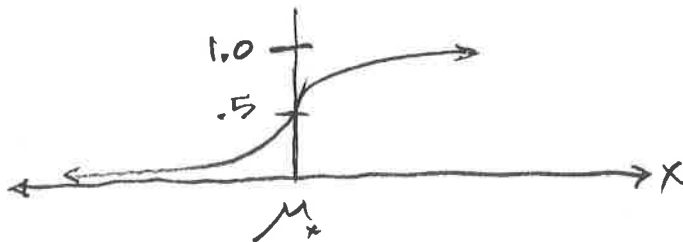
$$0 \leq \int_{-\infty}^{\infty} \text{pdf}(x) dx \leq 1.00$$

WE CAN DEFINE $\int_{-\infty}^x \text{pdf}(x) dx = \text{CDF}(x)$

↑
CUMULATIVE
DISTRIBUTION
FUNCTION

FOR THE NORMAL, THE CDF LOOKS LIKE

CDF:



THE CDF GIVES THE AREA UNDER THE pdf TO THE LEFT OF ANY POINT ON THE X AXIS,

eg THE AREA UNDER THE pdf TO THE LEFT OF $\mu_x = E[x]$ IS 0.500

THE B/S NOTATION OF $N(d_1)$ AND $N(d_2)$ MEANS GET THE VALUE OF THE CDF @ POINTS d_1 AND d_2 , (OR) EQUIVALENTLY THE AREA UNDER THE PDF CURVE TO THE LEFT OF d_1 AND d_2 .

§11.9 "WARRANTS ISSUED BY A COMPANY ON ITS OWN STOCK."

WARRANTS ARE SIMPLY INTERNALLY ISSUED EURO CALLS. THERE IS AN ISSUE W/ 'DILUTION' (AN INCREASE IN THE # OF SH'S OUTSTANDING OCCURS WHEN WARRANTS ARE EXERCISED AND STOCK IS THEREFORE ISSUED)

SEE §11.9 FOR DETAILS OF THE ARGUMENTS.

THE BOTTOM LINE IS THAT B/S CAN BE USED TO VALUE THE WARRANTS, BUT ONLY AFTER SOME MODIFICATIONS TO B/S ARE MADE.

THE MOD'S ARE:

- ① EVERYWHERE REPLACE S W/ $S + \left(\frac{M}{N}\right)W$
 W = WARRANT VALUE
 N = # OUTSTANDING SH'S (NOW)
 M = # WARRANTS (AFTER ISSUANCE)
 (EACH WARRANT GIVES THE HOLDER THE RIGHT TO δ SHARES)

- ② σ SHOULD MEASURE VOLATILITY OF THE EQUITY W/ WARRANTS IN PLACE. — WHICH IS PROBABLY NOT MUCH DIFFERENT FROM σ W/ STOCK ALONE.



(3) MULTIPLY THE ENTIRE FORMULA BY
 $(N\delta / N + M\delta)$

THIS

$$C = S N(d_1) - K e^{-r(T-t)} N(d_2)$$

BECOMES

$$(*) \quad W = \left\{ \left(S + \frac{M}{N} W \right) N(d_1) - K e^{-r(T-t)} N(d_2) \right\} \cdot \left(\frac{N\delta}{N + M\delta} \right)$$

$$d_1 = \frac{\ln\left(\frac{S + \frac{M}{N} W}{K}\right) + \left(r + \frac{1}{2} \sigma^{*2}\right)(T-t)}{\sigma^* \sqrt{T-t}}$$

$$d_2 = d_1 - \sigma^* \sqrt{T-t}$$

$\sim / \sigma^* =$ VOLATILITY OF
 EQUITY $\sim /$ OPTIONS
 IN PLACE

NOTICE THAT, UNLIKE REGULAR B/S, W NOW
 APPEARS ON BOTH SIDES OF THE EQUATION
 (IN B/S C WAS ON THE LHS ONLY)

THE ABOVE EQⁿ (*) CANNOT BE SOLVED
 ANALYTICALLY (VIA MATH). INSTEAD IT MUST
 BE SOLVED NUMERICALLY.

HOW TO DO THAT?



- ① SET THE ENTIRE EQUATION EQUAL TO ZERO VIA SUBTRACTING W FROM BOTH SIDES. THIS GIVES

$$0 = \underbrace{\left\{ \text{previous pg} \right\}}_{\text{previous pg}} \cdot \left(\frac{N\delta}{N+M\delta} \right) - W = \text{RHS}$$

- ② GUESS @ W & COMPUTE VALUE OF RHS. IF YOU ARE FORTUNATE, THE RHS WILL = 0 AND THUS YOUR GUESS OF W WAS CORRECT, AND YOU'RE DONE.

A MUCH MORE LIKELY SCENARIO IS THAT THE RHS $\neq 0$. IN THIS CASE GUESS ANOTHER VALUE FOR W . IF ON GUESS^{#1} RHS WAS POSITIVE, GUESS A W SO THAT THE SECOND TRY VALUE OF THE RHS IS NEGATIVE.

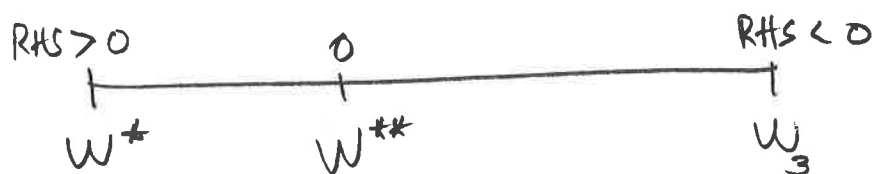
- ③ USE LINEAR INTERPOLATION TO MAKE A THIRD GUESS @ W



WE WANT THIS VALUE!
THE VALUE OF W THAT
GIVES $\text{RHS} = 0$

④ CHECK TO SEE IF W^* FROM THE LINEAR INTERPOLATION IS "CLOSE ENOUGH TO ZERO"
 SINCE RHS IS NOT A LINEAR EQUATION
 RHS EVALUATED @ W^* WILL NOT $= 0$!

⑤ DO 1 MORE LINEAR INTERPOLATION,
 IF W^* GAVE $RHS > 0$ THEN PICK
 ANOTHER W (CLOSE TO W^*) THAT GIVES
 $RHS < 0$ (AND VICE VERSA). CALL THIS
 GUESS W_3 . THEN DO 1 MORE
 LINEAR INTERPOLATION (THE SECOND ITERATION)



↑
 WILL STILL NOT GIVE $RHS = 0$
 BUT IT WILL BE A LOT CLOSER
 TO ZERO THAN W^* GAVE.

⑥ IF W^{**} IS STILL NOT "CLOSE ENOUGH" TO ZERO
 YOU NEED TO KEEP DOING THE LINEAR
 INTERPOLATION (IN A LOOP) UNTIL YOU
 GET

$$-1 \times \text{swtEpsilon} < RHS < \text{swtEpsilon}$$

YOU SET swtEpsilon TO BE SOME SMALL #
 THAT DEFINES "CLOSE ENOUGH TO ZERO."

§11.10 IMPLIED VOLATILITIES

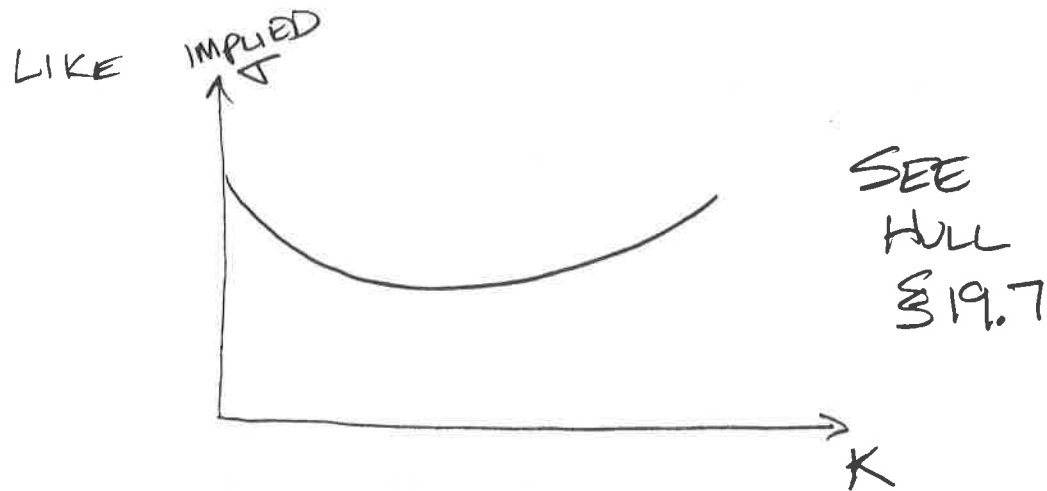
THE B/S SOLUTION TO THE B/S DIFF EQⁿ CANNOT BE SOLVED EXPLICITLY FOR σ . HOWEVER IF EVERY INPUT VARIABLE (INCLUDING C) EXCEPT σ IS SPECIFIED, THEN THE ONLY UNKNOWN IS σ . THERE WILL BE SOME VALUE OF σ THAT MAKES THE B/S EQⁿ TRUE. THIS VALUE IS KNOWN AS THE IMPLIED VOLATILITY.

SINCE IT IS IMPOSSIBLE TO SOLVE B/S FOR σ EXPLICITLY, IT MUST BE FOUND NUMERICALLY VIA SOME TYPE OF 'SEARCH ALGORITHM'.

LINEAR INTERPOLATION, AS OUTLINED IN §11.09 WORKS FINE - BUT A FEW ITERATIONS (>3) SHOULD BE USED.

IF YOU HAVE BUILT A B/S SPREADSHEET YOU CAN USE TOOLS, GOAL SEEK (WHICH EMPLOYS SEVERAL ITERATIONS OF LINEAR INTERPOLATION) TO FIND THE IMPLIED VOL.

YOU CAN USE IMPLIED σ 'S TO ASSESS THE MKT'S OPINION REGARDING THE CURRENT VOLATILITY OF THE UNDERLYING ASSET. BEWARE THAT IF YOU HAVE SEVERAL OPTION PRICES (FOR OPTIONS w/ DIFFERING K , BUT SAME TIME TO MATURITY) THEY WILL NOT HAVE THE SAME IMPLIED σ .! TYPICALLY A GRAPH OF IMPLIED σ AS A FN OF K (FOR FIXED S AND T) LOOKS



THIS IS CALLED THE VOLATILITY SMILE 😊.
THE LOWEST IMP. σ TYPICALLY OCCURS W/
 $K = S$.

THERE ARE VARIOUS METHODS OF EXPLAINING
THE VOLATILITY SMILE. SEE HULL CH 19,
ESPECIALLY SECTION 19.7 FOR MORE ON THIS.

GIVEN THAT DIFFERENT K 'S GIVE DIFFERENT
IMPLIED σ 'S, WHICH σ 'S SHOULD BE USED
TO ASSESS THE MKT'S VIEW OF σ ?

FACT: OPTIONS ARE MOST SENSITIVE TO CHANGES
IN σ WHEN $K = S$, THUS OPTIONS 'AT THE MONEY'
PROVIDE THE MOST INFORMATION WITH RESPECT
TO IMPLIED σ .

THUS USE IMP. σ FOR THE OPTION THAT
HAS K CLOSE TO S IN ORDER GAUGE THE
MKT'S VIEW OF σ .



§11.11 CAUSES OF VOLATILITY

STUDENTS: READ THIS SECTION ON YOUR OWN.

THE BOTTOM LINE IS THAT VOLATILITY
ARISES ON TRADING DAYS, NOT CALENDAR
DAYS.

THUS WE ASSUME 252 DAYS/YR, NOT 365.

§11.12 DIVIDENDS

• EURO OPTIONS

SIMPLY SUBTRACT PV OF DIVIDENDS FROM S ,
CALL THAT S^* , AND USE B/S w/ S^* .

• AMERICAN OPTIONS

GOOD STUFF, BUT WE'LL SKIP IN THE
INTEREST OF TIME.

§ 11.13 SUMMARY

— IMPORTANT — READ IT.