

# Notes on Paul Wilmott Introduces Quantitative Finance

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## 0.1 Chapter 1: Products and Markets: Equities, Commodities, Exchange Rates, Forwards and Futures

### THE TIME VALUE OF MONEY

Two types of interest:

- Simple interest - When the interest you received is based only on the amount you initially invest
- Compound interest - When you also get interest on your interest.

Two forms of compound interest: discretely compounded and continuously compounded.

Invest \$1 in bank at a discrete interest rate  $r$  paid once per annum. At the end of year 1 bank account will contain  $1 \times (1 + r)$ . After 2 years and  $n$  years I will have  $(1 + r)^2$  and  $(1 + r)^n$ . For  $r = 10\%$ , for first and second year I will have \$1.10 and \$1.21.

Suppose I receive  $m$  interest payments at a rate of  $r/m$  per annum. After 1 year I'll have

$$\left(1 + \frac{r}{m}\right)^m \quad (1)$$

Imagine interest payments come at increasingly frequent intervals but at an increasingly smaller interest rate. Taking limit  $m \rightarrow 100$  leads to a rate of interest that is paid continuously, giving money amount in bank after one year if interest is continuously compounded

$$\begin{aligned} \left(1 + \frac{r}{m}\right)^m &= e^{\ln(1 + \frac{r}{m})^m} \\ &= e^{m \ln(1 + \frac{r}{m})} \\ &\sim e^r \end{aligned} \quad (2)$$

After time  $t$  this amounts to

$$\left(1 + \frac{r}{m}\right)^{mt} \sim e^{rt} \quad (3)$$

This can also be derived by a differential equation. For an amount  $M(t)$  in the bank at time  $t$ , checking bank account at time  $t$  and slightly later  $t + dt$ , the amount will have increased by

$$M(t + dt) - M(t) \approx \frac{dM}{dt} dt + \dots \quad (4)$$

where RHS is just a Taylor series expansion. But the interest I receive must be  $\propto M(t), r$ , and  $dt$ . Hence

$$\begin{aligned} \frac{dM}{dt} dt &= rM(t)dt \\ \implies \frac{dM}{dt} &= rM(t) \end{aligned} \quad (5)$$

with solution

$$M(t) = M(0)e^{rt} \quad (6)$$

relating money value I have now to the value in the future. Conversely, if I know I'll get \$1 at time  $T$  in the future, its value at an earlier time  $t$  is  $e^{-r(T-t)}$ . This relates future cashflows to present by multiplying this factor e.g. for  $r = 0.05$ , the present value ( $t = 0$ ) of \$1000000 to be received in two years ( $T = 2$ ) is  $\$1000000 \times e^{-0.05 \times 2} = \$904837$ .

### FIXED-INCOME SECURITIES

Two types of interest payments exist: **fixed** and **floating**. **Coupon-bearing** bonds pay out a known amount every six months or year, etc. This is the **coupon** and would often be a fixed rate of interest. At

the end of your fixed term you get a final coupon and return of the **principal**, the amount on which the interest was calculated. **Interest rate swaps** are an exchange of a fixed rate of interest for a floating rate of interest. Governments and companies issue bonds as a form of borrowing. The less creditworthy the issuer, the higher the interest that they will have to pay out. Bonds are actively traded, with prices that continually fluctuate.

## INFLATION PROOF BONDS

UK inflation is measured by **Retail Price Index (RPI)**. This index is

- a measure of year-on-year inflation using a 'basket' of goods and services including mortgage interest payments.
- published monthly.
- roughly speaking, the amounts of the coupon and principal are scaled with the increase in the RPI over the period from the issue of the bond to the time of the payment.

US inflation is measured by **Consumer Price Index (CPI)**.

## FORWARDS AND FUTURES

A **forward contract** is an agreement where one party promises to buy an asset from another party at some specified time in the future and at some specified price.

- No money changes hands until the **delivery date** or **maturity** of the contract.
- It's an absolute obligation to buy the asset at the delivery date.
- The asset can be a stock, a commodity or a currency.
- The **delivery price** is the amount that's paid for the asset at the delivery date.
  - Set at the time the forward contract is entered into.
  - At an amount that gives the forward contract a value of zero initially.
  - As maturity approaches the particular forward contract value we hold will change in value, from initially zero to the difference between the underlying asset and the delivery price at maturity.
- The **forward price** of different maturities are the delivery prices for forward contracts of the quoted maturities, should we enter into such a contract now.

A **futures contract** is very similar to forward contract. Futures are derivative financial contracts that obligate the parties to transact an asset at a predetermined future date and price. The buyer must purchase or the seller must sell the underlying asset at the set price, regardless of the current market price at the expiration date.

- Usually traded through an exchange, are very liquid instruments and have lots of rules and regulations surrounding them.
- Profit or loss from futures position is calculated everyday and the value change is paid from one party to the other, hence there is a gradual payment of funds from initiation until maturity.
- Because you settle the change in value on a daily basis, the value of a futures contract at any time during its life is zero.
- Prices vary day to day, but at maturity must be the same as the asset you're buying.
- Provided interest rates are known in advance, forward prices and futures prices of the same maturity must be identical.

Forwards and futures have two main uses:

- Speculation
  - In believing market will rise, you can benefit by entering into a forward/futures contract.

- Money will exchange hands at maturity/every day in your favour.
- Hedging i.e. avoidance of risk
  - If you are expecting to get paid in yen in six months' time but your expenses are all in dollars, you can enter into a futures contract to guarantee an exchange rate for your yen income amount.
  - You're locked in this dollar/yen exchange rate. The lack of exposure to fluctuations means you won't benefit if yen appreciates.

The **no-arbitrage** principle: Consider a forward contract that obliges us to pay  $\$F$  at time  $T$  to receive the underlying asset. The **spot price**  $\$S(t)$  is the asset price at present time  $t$  for which we could get immediate delivery of the asset. At maturity, we'll pay  $\$$  and receive the asset, then worth  $\$S(T)$ , a value that remains unknown until time  $T$  which determines the profit/loss amount  $S(T) - F$ . By entering into a special portfolio of trades now we can eliminate all randomness in the future.

1. Enter into the forward contract, which costs nothing up front but exposes us to the uncertainty in the asset value at maturity.
2. Simultaneously sell the asset a.k.a **going short** i.e. when you sell something you don't own with some timing restrictions.
3. Still with net position of zero, we now have  $S(t)$  amount of cash from the sale of asset, a forward contract, and a short asset position  $-S(t)$ . Put cash in bank to receive interest.
4. At maturity we pay  $F$  and receive asset  $S(T)$ . The bank account amount with interest is now  $S(t)e^{r(T-t)}$ , with a net position at maturity of  $S(T)e^{r(T-t)} - F$ .

**Table 1.1** Cashflows in a hedged portfolio of asset and forward.

Holding	Worth today ( $t$ )	Worth at maturity ( $T$ )
Forward	0	$S(T) - F$
– Stock	$-S(t)$	$-S(T)$
Cash	$S(t)$	$S(t)e^{r(T-t)}$
Total	0	$S(t)e^{r(T-t)} - F$

5. The no-arbitrage principle states that a portfolio started with zero worth end up with a predictable amount, which should also be zero. Hence we've a relationship between spot price and forward price.

$$F = S(t)e^{r(T-t)} \quad (7)$$

6. If  $F < S(t)e^{r(T-t)}$ , a riskless arbitrage opportunity can be exploited by entering into the same deals.
7. At maturity you will have  $S(t)e^{r(T-t)}$  in the bank, a short asset and a long forward. The asset position cancels when you hand over the amount  $F$ , leaving you with a profit of  $S(t)e^{r(T-t)} - F$ .
8. If  $F > S(t)e^{r(T-t)}$ , simply enter into the opposite positions i.e. going short the forward in order to make a riskless profit.

## MORE ABOUT FUTURES

The nature of futures contracts:

### **Available assets**

A futures contract will specify

- the asset which is being invested in
- the quantity of asset that must be delivered
- the quality of the commodities, usually comes in a variety of grades i.e. oil, sugar, orange juice, wheat, etc. futures contracts lay down rules for precisely what grade of oil, sugar, etc. may be delivered.

## Delivery and settlement

There may be some leeway in the precise delivery date

- Most futures contracts are closed out before delivery, with the trader taking the opposite position before maturity.
- If position is not closed, then asset is delivered.
- When the asset is another financial contract settlement is usually made in cash.

## Margin

- **Marking to market** - The changes in value of futures contracts are settled each day.
- Exchanges insist on traders depositing a sum of money in a **margin account** to cover changes in their positions value.
- As the position is marked to market daily, money is deposited or withdrawn from this margin account.

Two types of margin: **Initial margin**, **Maintenance margin**

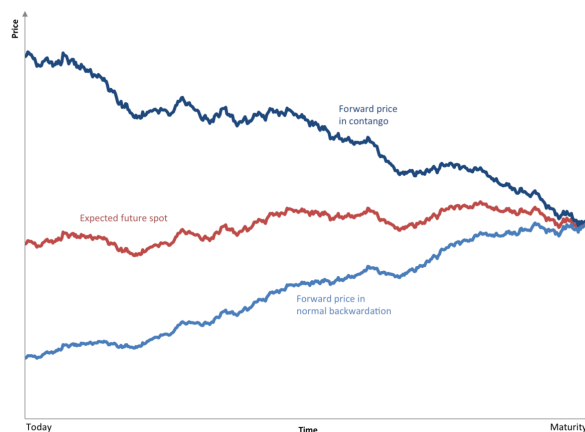
The initial amount is the amount deposited at the initiation of the contract. The total amount held as margin must stay above a prescribed maintenance margin. If it ever falls below this level then more money (or equivalent in bonds, stocks, etc.) must be deposited.

## Commodity futures

Futures on commodities don't necessarily obey the no-arbitrage law due to storage. In practice the future price will be higher than the theoretical no-storage-cost amount since the holder of the futures contract must compensate the holder of the commodity for his storage costs. Often the people holding the commodity benefit from it in some way. The benefit from holding the commodity is commonly measured in terms of the **convenience yield**  $c$ :

$$F = S(t)e^{(r+s-c)(T-t)} \quad (8)$$

Whenever  $F < S(t)e^{r(T-t)}$  the market is said to be in **backwardation**, otherwise if  $F > S(t)e^{r(T-t)}$  the market is in **contango**.



## FX futures

Modifying the result from no-arbitrage to allow for interest received on the foreign currency  $r_f$ , we get

$$F = S(T)e^{(r-r_f)(T-t)}. \quad (9)$$

## Index futures

Futures contracts on stock indices are settled in cash, with dividends playing a similar role to that of a foreign interest rate on FX futures. So

$$F = S(t)e^{(r-q)(T-t)} \quad (10)$$

## 0.2 Chapter 2: Derivatives

### OPTIONS

The holder of future or forward contracts is obliged to trade at the maturity of the contract, unless the position is closed before maturity. Otherwise, the holder must take possession of the asset of the contract e.g commodity, currency regardless of whether its price has risen or fallen. The simplest **option** gives the holder the *right* to trade in the future at a previously agreed price but takes away the obligation. Specifically, a **call option** is the right to buy an asset for an agreed amount at a specified time in the future.

Example: A call option on Microsoft stock

- The holder has the right to purchase one Microsoft stock for \$25 in one month's time, with \$24.5 current price.
- The price \$25 is called the **exercise/strike price**.
- The **expiry** or **expiration date** is the date on which we must **exercise** our option, should we choose to.
- The **underlying asset** is the stock the option is based on.

We would exercise the option at expiry if the stock  $S$  is above the strike  $E$  and not if it's below. At expiry it's worth

$$\max(S - E, 0), \quad (11)$$

where the function of the underlying asset is called the **payoff function**, with 'max' representing optionality.

A **put option** is the right to *sell* a particular asset for an agreed amount at a specified time in the future. The holder of a put option wants the stock price to fall so that he can sell the asset for more than it's worth. The payoff function for a put option is

$$\max(E - S, 0), \quad (12)$$

with option only being exercised if the stock falls below the strike price.

The higher the strike the lower the value of a call option but the higher the value of the puts. Since the call allows you to buy the underlying for the strike, so that the lower the strike price the more this right is worth. The opposite is true for a put since it allows you to sell the underlying for the strike price. Also, the longer the time to maturity, the higher the value of the call. As the time to expiry decrease, as there is less and less time for the underlying to move, so the option value must converge to the payoff function.

Calls and puts have a non-linear dependence on they underlying asset. This contrasts with futures which have a linear dependence on the underlying. Calls and puts are the two simplest forms of options and are often referred to as **vanilla**.

### DEFINITION OF COMMON TERMS

- **Premium** - The amount paid for the contract initially.
- **Underlying (asset)** - The financial instrument on which the option value depends. Stocks, commodities, currencies and indices are going to be denoted by  $S$ . The option payoff is defined as some function of the underlying asset at expiry.
- **Strike (price) or exercise price** - The amount for which the underlying can be bought (call) or sold (put). This will be denoted by  $E$ . This definition only really applies to the simple calls and puts. For more complicated contracts, this definition is extended.
- **Expiration (date) or expiry (date)** - Date on which the option can be exercised or date on which the option ceases to exist or give the holder any rights, denoted by  $T$ .
- **Intrinsic value** - The payoff that would be received if the underlying is at its current level when the option expires.

- **Time value** - Any value that the option has above its intrinsic value. The uncertainty surrounding the future value of the underlying asset means that the option value is generally different from the intrinsic value.
- **In the money** - An option with positive intrinsic value. A call option when the asset price is above the strike, a put option when the asset price is below the strike.
- **Out of the money** - An option with no intrinsic value, only time value. A call option when the asset price is below the strike, a put option when the asset price is above the strike.
- **At the money** - A call or put with a strike that is close to the current asset level.
- **Long position** - A positive amount of quantity, or a positive exposure to a quantity.
- **Short position** - A negative amount of a quantity, or a negative exposure to a quantity. Many assets can be sold short, with some constraints on the length of time before they must be bought back.

### PAYOFF DIAGRAMS

A **payoff diagram** plots the value of an option at expiry as a function of the underlying. At expiry the option is worth a known amount. For a call and put option the contract is worth  $\max(S-E, 0)$  and  $\max(E-S, 0)$  respectively, represented by the bold lines below.

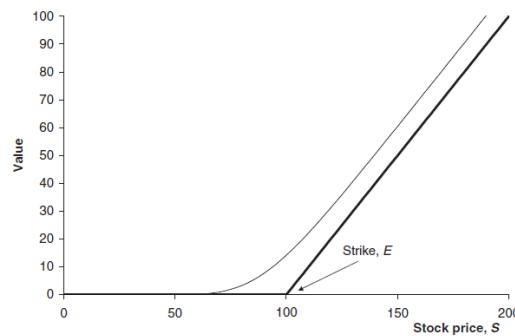


Figure 2.5 Payoff diagram for a call option.

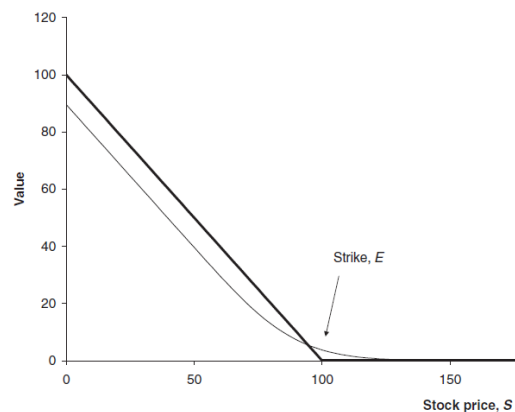


Figure 2.8 Payoff diagram for a put option.

### Other representations of value

The payoff diagrams above only shows the money worth of your option contract at expiry. It makes no allowance for how much premium you had to pay for the option. In a **profit diagram** for a call option, we adjust for the original cost of the option by subtracting from the payoff the premium originally paid for the call option.

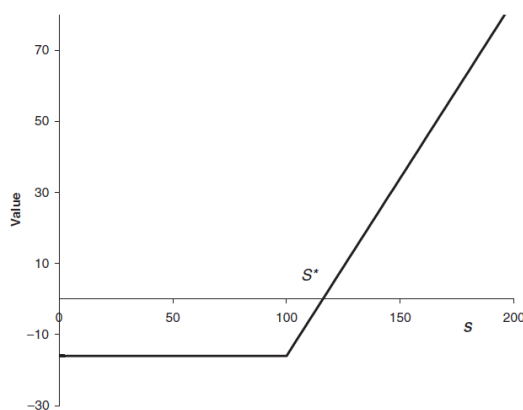


Figure 2.11 Profit diagram for a call option.

This figure is helpful because it shows how far into the money the asset must be at expiry before the option becomes profitable. Asset value  $S^*$  is the point which divides profit from loss; if the asset at expiry is above  $S^*$  then the contract has made a profit and vice versa. The profit diagram takes no account of the time value of money. The premium is paid up front but the payoff, if any, is only received at expiry. To be consistent one should either discount the payoff by multiplying by  $r^{-r(T-t)}$  to value everything at the present, or multiply the premium by  $e^{r(T-t)}$  to value all cashflows at expiry.

## WRITING OPTIONS

The **writer** of an option is the person who promises to deliver the underlying asset, if the option is a call, or buy it, if the option is a put. The writer is the person who receives the premium, and is liable if the option is exercised. The option holder can sell the option on to someone else to close his position. The purchaser of the option hands over a premium in return for special rights, and uncertain outcome. The writer receives a guaranteed payment up front, but then has obligations in the future.

## MARGIN

Buying an option

- Downside: initial premium
- Upside: may be unlimited

Writing an option

- Downside: could be huge
- Upside: Limited

To cover the risk of default in the event of an unfavourable outcome, the **clearing houses** that register and settle options insist on the deposit of a margin by the writers of options.

## MARKET CONVENTIONS

Often simpler option contracts bought and sold through exchanges are standardised to follow conventions. Simple calls and puts come in series, referring to the strike and expiry dates. Typically a stock has three choices of expiries trading at any time. Having standardised contracts traded through an exchange promotes liquidity of the instruments. **Over the counter (OTC)** contracts are an agreement between two parties, often brought together by an intermediary. The agreed terms are flexible, without needing to follow any conventions.

## THE VALUE OF THE OPTION BEFORE EXPIRY

How much is an option contract worth *now*, before expiry? How much would you pay for a contract, a piece of paper, giving you rights in the future? What is clear is that the contract value before expiry will depend on how high the asset price is today and how long there is before expiry. The longer the time to expiry, the more time there is for the asset to rise or fall.



Let  $V(S, t)$  be a function of the value of the underlying asset  $S$  at time  $t$  which represents the value of the option contract. At expiry date  $t = T$ , the value of the contract at expiry function is just the payoff function, which we know from before. For a call option it's

$$V(S, T) = \max(S - E, 0). \quad (13)$$

The fine lines in Figure 2.5 and 2.8 are the values of the contracts  $V(S, t)$  at *some time before expiry*, plotted against  $S$ .

### **FACTORS AFFECTING DERIVATIVE PRICES**

The underlying value asset  $S$  and time to expiry  $t$  are **variables** of the options price. The interest rate and strike price are examples of **parameters** of the options price. The interest rate affects the option value via the time value of money since the payoff is received in the future. The higher the strike in a call, the lower the value of the call. The **volatility** is an important parameter which impacts an option's value. It is a measure of fluctuation in the asset price i.e. a measure of randomness. The technical definition of volatility is the 'annualized standard deviation of the asset returns'.

### **SPECULATION AND GEARING**

A dramatic move in the underlying that leads to an option expires in the money may lead to a large profit relative the amount of investment.

**Example:** Today's date is 14th April and the price of Wilmott Inc. stock is \$666. The cost of a 680 call option with expiry 22nd August is \$39. I expect the stock to rise significantly between now and August, how can I profit if I am right?

**Buy the stock:** Suppose I buy the stock for \$666. And suppose that by the middle of August the stock has risen to \$730. I will have made a profit of \$64 per stock. More importantly my investment will have risen by

$$\frac{730 - 666}{666} \times 100 = 9.6\%. \quad (14)$$

**Buy the call:** If I buy the call option for \$39, then at expiry I can exercise the call, paying \$680 to receive something worth \$730. I have paid \$39 and I get back \$50. This is a profit of \$11 per option, but in percentage terms I have made

$$\frac{\text{value of asset at expiry} - \text{strike} - \text{cost of call}}{\text{cost of call}} \times 100 = \frac{730 - 680 - 39}{39} \times 100 = 28\%. \quad (15)$$

This is an example of **gearing** or **leverage**. The out-of-the-money option has a high gearing, a possible high payoff for a small investment. The downside of this leverage is that the call option is more likely than not to expire completely worthless and you will lose all of your investment. If Wilmott Inc. remains at \$666 then the stock investment has the same value but the call option experiences a 100% loss.

For highly leveraged contracts, the buyer is very likely to lose but at the risk of only a small amount. But the writer is risking a large loss in order to make a probable small profit. The writer is likely to think twice about such a deal unless he can offset his risk by buying other contracts. This offsetting of risk by buying other related contracts is called **hedging**.

### **EARLY EXERCISE**

The simple options described above are examples of **European options** because exercise is only permitted at expiry. Some contracts allow the holder to exercise at any time before expiry, and these are called **American options**. American options give the holder more rights than their European equivalent and can therefore be more valuable, and they can never be less valuable. The main point of interest with American-style contracts is deciding when to exercise. Most stock options are traded American-style while most index options are traded European-style. **Bermudan options** allow exercise on specified dates, or in specified periods.

### **PUT-CALL PARITY**

Imagine buying a European call option with a strike of  $E$  and an expiry of  $T$  and writing a European put option with the same strike and expiry. With a present date of  $t$ , the payoff you receive at  $T$  for the call and put will look like the lines in first and second plot of Figure 2.14 respectively. The payoff for

the put is negative, since writing the option leads to liability for the payoff. The portfolio payoff for the two options is the sum of individual payoffs i.e.

$$\max(S(T) - E, 0) - \max(E - S(T), 0) = S(T) - E, \quad (16)$$

If I buy the asset today it will cost me  $S(t)$  and be worth  $S(T)$  at expiry. It's unclear what the value of  $S(T)$  will be but to guarantee to get that amount you'd have to buy the asset. To lock in a payment of  $E$  at time  $T$  involves a cash flow of  $Ee^{-r(T-t)}$  at time  $t$ . The conclusion is that the portfolio of a long call and a short put gives exactly the same payoff as a long asset, short cash position. The equality of these cashflows is independent of the future behaviour of the stock and is model independent:

$$C - P = S - Ee^{-r(T-t)}, \quad (17)$$

where  $C$  and  $P$  are today's values of the call and put respectively. This relationship holds at any time up to expiry and is known as **put-call parity**. For European options, longing a call and shorting a put with the same strike is equivalent to longing a forward contract with a forward price equivalent to the options' strike price. If this relationship did not hold for whatever reason there would be riskless arbitrage opportunities to be exploited to make money.

Table 2.1 shows the cashflows in the perfectly hedged portfolio. In this table I have set up the cashflows to have a guaranteed value of zero at expiry.

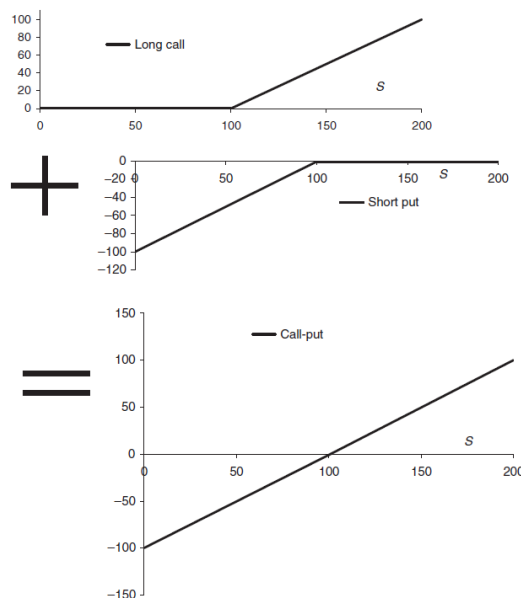


Figure 2.14 Schematic diagram showing put-call parity.

**Table 2.1** Cashflows in a hedged portfolio of options and asset.

Holding	Worth today ( $t$ )	Worth at expiry ( $T$ )
Call	$C$	$\max(S(T) - E, 0)$
-Put	$-P$	$-\max(E - S(T), 0)$
-Stock	$-S(t)$	$-S(T)$
Cash	$Ee^{-r(T-t)}$	$E$
Total	$C - P - S(t) + Ee^{-r(T-t)}$	0

## BINARIES OR DIGITALS

The **binary** or **digital options** have a payoff at expiry that is discontinuous in the underlying asset price. Examples of payoff diagram for a binary call and a binary put are shown below. This contract pays \$1 at expiry, time  $T$ , if the asset price is then greater than the exercise price  $E$ .

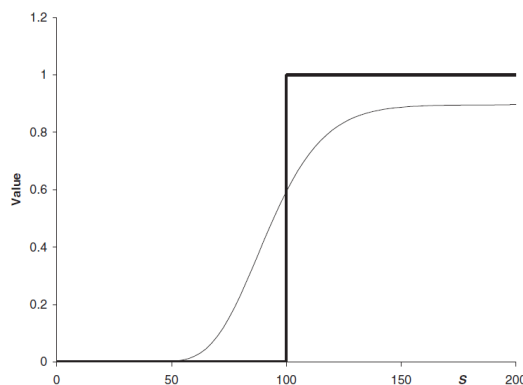


Figure 2.15 Payoff diagram for a binary call option.

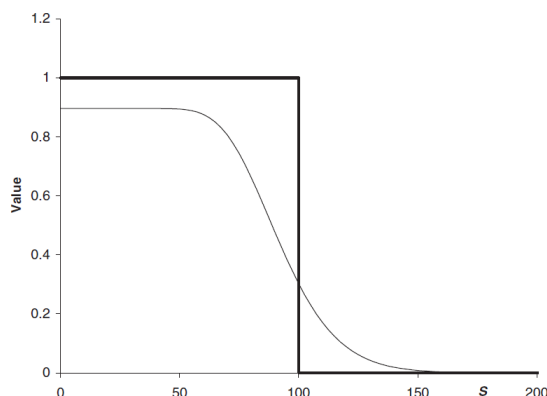


Figure 2.16 Payoff diagram for a binary put option.

The holder of a binary put receives \$1 if the asset is below  $E$  at expiry. The binary put would be bought by someone expecting a modest fall in the asset price. If you hold both a binary call and a binary put with the same strikes and expiries, you will always get \$1 regardless of the level of the underlying at expiry i.e.

$$\text{Binary call} + \text{Binary put} = e^{-r(t-t)} \quad (18)$$

This is also known as the **binary put-call parity relationship**.

## BULL AND BEAR SPREADS

The bull and bear spreads is an example of **portfolio of options** or an **option strategy**.

- Suppose I buy one call option with a strike of 100 and write another with a strike of 120, both with the same expiry. The resulting portfolio has a payoff as shown in Figure 2.17.
- The payoff is continuous and is zero below 100, 20 above 120 and linear in between. This strategy is called a **bull spread** or **call spread** since it benefits if the market is rising.
- For a bull spread made up of calls with strikes  $E_1$  and  $E_2$  where  $E_2 > E_1$ , the payoff is

$$\frac{1}{E_2 - E_1} (\max(S - E_1, 0) - \max(S - E_2, 0)). \quad (19)$$

Here the payoff is scaled to 1. Similarly, Figure 2.18 shows the payoff of a **bear spread** or a **put spread** i.e. benefit from a falling market, where if I write a put option with strike 100 and buy a put with strike 120.

- A strategy involving options of the same type (i.e. calls or puts) is called a **spread**.

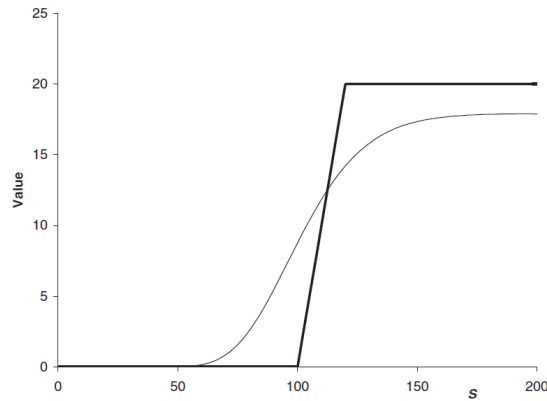


Figure 2.17 Payoff diagram for a bull spread.

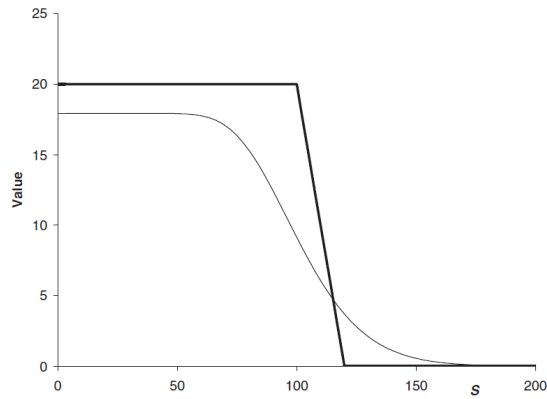


Figure 2.18 Payoff diagram for a bear spread.

## STRADDLES AND STRANGLES

The **straddle** consists of a call and a put with the same strike, with a payoff diagram shown in Figure 2.19. Such a position is usually bought at the money by someone who expects the underlying to either rise or fall, but not to remain at the same level. The straddle would be sold by someone with the opposite view, someone who expects the underlying price to remain stable. This is an expensive strategy as money is spent on both premium, hoping for an explosive move on the price of the underlying. This is equivalent to being long volatility i.e. betting on increasing volatility since the options are priced with a given level of volatility and having bought two options meant that profits are only made if they are extra volatile.

The **strangle** consists of a call and a put with different strikes, and can be either an **out-of-the-money strangle** (out of the money put and call) or an **in-the-money strangle**. The payoff for an out-of-the-money strangle is shown in Figure 2.22. Here the motivated buyer tend to expect an even larger move in the underlying one way or another. The contract is usually bought when the asset is around the middle of the two strikes and is cheaper than a straddle. This cheapness means that the gearing for the out-of-the-money strangle is higher than that for the straddle. The downside is that there is a much greater range over which the strangle has no payoff at expiry, for the straddle there is only the one point at which there is no payoff.

The straddles and strangles are called **volatility trades** since the contracts are bought or sold based on speculations on the direction of volatility. Straddles and strangles are rarely held until expiry. A strategy involving options of different types i.e. both calls and puts, is called a **combination**.

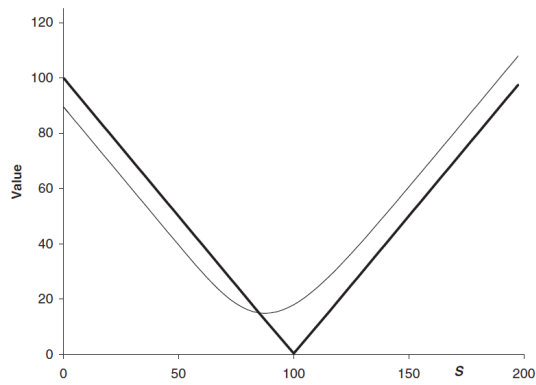


Figure 2.19 Payoff diagram for a straddle.

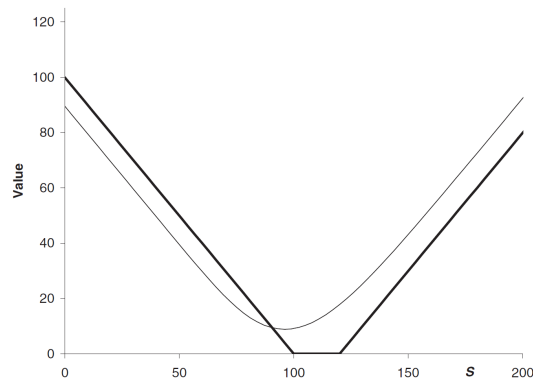


Figure 2.22 Payoff diagram for a strangle.

## **RISK REVERSAL**

The **risk reversal** is a combination of a long call, with a strike above the current spot, and a short put, with a strike below the current spot at the same expiry. Its payoff is shown in Figure 2.23. This strategy

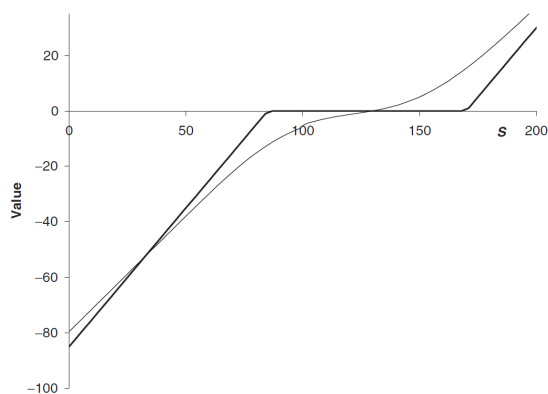


Figure 2.23 Payoff diagram for a risk reversal.

protects against unfavorable price movements in the underlying position but limits the profits that can be made on that position. If an investor is long a stock, they could create a short risk reversal to hedge their position by buying a put option and selling a call option. If an investor is short an underlying asset, the investor hedges the position with a long risk reversal by purchasing a call option and writing a put option on the underlying instrument. If the price of the underlying asset rises, the call option will become more valuable, offsetting the loss on the short position. If the price drops, the trader will profit on their short position in the underlying, but only down to the strike price of the written put.

## **BUTTERFLIES AND CONDORS**

A **butterfly spread** involves the purchase and sale of three options with different strikes. For example, buying a call of 90, writing two calls struck at 100 and buying a 110 call gives the payoff in Figure 2.24 i.e. maximum payoff is 10. This is a cheap position that is typically entered into if the underlying is believed to not go anywhere. The **condor** is like a butterfly except that four strikes, and four call options, are used. The payoff is shown in Figure 2.25.

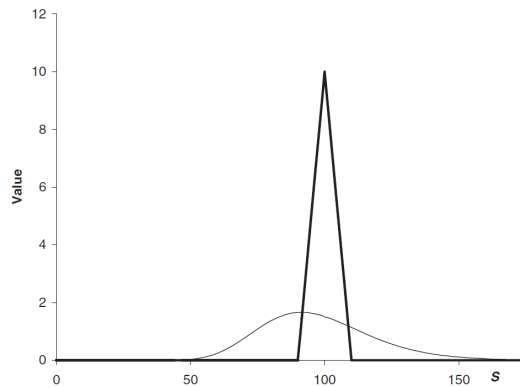


Figure 2.24 Payoff diagram for a butterfly spread.

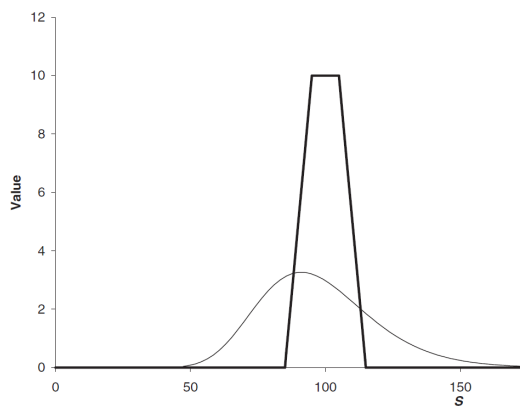


Figure 2.25 Payoff diagram for a condor.

## LEAPS AND FLEX

**Long-term equity anticipation securities(LEAPS)** are longer-dated exchange-traded calls and puts. They are standardized so that they expire in January each year and are available with expiries up to three years. They come with three strikes, corresponding to at the money and 20% in and out of the money with respect to the underlying asset price when issued. The **FLEXible EXchange-traded options(FLEX)** allow for a degree of customisation in the expiry date (up to five years), the strike price and the exercise style.

## WARRANTS

**Warrants** are call options issued by a company on its own equity.

- Usually have a longer lifespan
- On exercise the company issues new stock to the warrant holder
- On exercise the holder of a traded option receives stock that has already been issued.
- Exercise is usually allowed any time before expiry, but after an initial waiting period.
- The typical lifespan of a warrant is five or more years. Occasionally **perpetual warrants** are issued, these have no maturity.

## CONVERTIBLE BONDS

**Convertible bonds (CBs)** pay a stream of coupons with a final repayment of principal at maturity, but they can be converted into the underlying stock before expiry. On conversion rights to future coupons are lost. If the stock price is low then there is little incentive to convert to the stock, the coupon stream is more valuable. In this case the CB behaves like a bond. If the stock price is high then conversion is likely and the CB responds to the movement in the asset. Because the CB can be converted into the asset, its value has to be at least the value of the asset. This makes CBs similar to American options; early exercise and conversion are mathematically the same. As a hybrid security, the price of a convertible bond is especially sensitive to changes in interest rates, the price of the underlying stock, and the issuer's credit rating.

## OVER THE COUNTER OPTIONS

**Over the counter (OTC)** options are sold privately from one counterparty to another. A **term sheet** specifies the precise details of an OTC contract. Figure 2.27 shows a term sheet for an OTC put option.

*Preliminary and Indicative  
For Discussion Purposes Only*

<u>Over-the-counter Option linked to the S&amp;P500 Index</u>	
<b>Option Type</b>	European put option, with contingent premium feature
<b>Option Seller</b>	XXXX
<b>Option Buyer</b>	[dealing name to be advised]
<b>Notional Amount</b>	USD 20MM
<b>Trade Date</b>	□
<b>Expiration Date</b>	□
<b>Underlying Index</b>	S&P500
<b>Settlement</b>	Cash settlement
<b>Cash Settlement Date</b>	5 business days after the Expiration Date
<b>Cash Settlement Amount</b>	Calculated as per the following formula: $\# \text{Contracts} * \max[0, S\&P_{\text{strike}} - S\&P_{\text{final}}]$ where $\# \text{Contracts} = \text{Notional Amount} / S\&P_{\text{initial}}$ This is the same as a conventional put option: <b>S&amp;Pstrike</b> will be equal to <b>95% of the closing price on the Trade Date</b> <b>S&amp;Pfinal</b> will be the level of the Underlying Index at the valuation time on the Expiration Date <b>S&amp;Pinitial</b> is the level of the Underlying Index at the time of execution [2%] of Notional Amount 5 business days after Trade Date
<b>Initial Premium Amount</b>	
<b>Initial Premium Payment Date</b>	
<b>Additional Premium Amounts</b>	[1.43%] of Notional Amount per Trigger Level
<b>Additional Premium Payment Dates</b>	The Additional Premium Amounts shall be due only if the Underlying Index at any time from and including the Trade Date and to and including the Expiration Date is equal to or greater than any of the Trigger Levels.
<b>Trigger Levels</b>	103%, 106% and 109% of S&P500initial
<b>Documentation</b>	ISDA
<b>Governing law</b>	New York

This indicative term sheet is neither an offer to buy or sell securities or an OTC derivative product which includes options, swaps, forwards and structured notes having similar features to OTC derivative transactions, nor a solicitation to buy or sell securities or an OTC derivative product. The proposal contained in the foregoing is not a complete description of the terms of a particular transaction and is subject to change without limitation.

**Figure 2.27** Term sheet for an OTC 'put.'

In this OTC

- The holder gets a put option on S&P 500, but cheaper than a vanilla put option.
- This contract is cheap because part of the premium does not have to be paid until and unless the underlying index trades above a specific level.
- Each time a new level is reached an extra payment is triggered. This feature means that the contract is not vanilla, and makes the pricing more complicated.
- Quantities in square brackets will be set at the time that the deal is struck.

## 0.3 Chapter 3: The Binomial Model

### INTRODUCTION

The binomial model may be thought of as being either a genuine model for the behaviour of equities, or, alternatively as a numerical method for the solution of the Black-Scholes equation; in this case, very similar to an explicit finite-difference method. It's a teaching aid to explain delta hedging, risk elimination and risk-neutral valuation.

Cons:

- Poor model for stock price behaviour. It says the stock can either go up or down by a known amount which is unrealistic. Results that follow from this model hinge on there being only two prices for the stock tomorrow and will break upon introduction of a third state.
- It's an old numerical scheme that predates modern numerical methods.

### EQUITIES CAN GO DOWN AS WELL AS UP

Scenario: We will have a stock, and a call option on that stock expiring tomorrow. The stock can either rise or fall by a known amount between today and tomorrow. Interest rates are zero. There is a certain probability  $p$  of the stock rising and  $1 - p$  of the stock falling. Let's introduce the call option on the stock which has a strike of \$100 and expires tomorrow. If the stock price rises to 101, the option's payoff will just be  $101 - 100 = 1$ . If the stock falls to 99 tomorrow, the payoff is then zero, since the option has expired out of the money. There is a 0.6 probability of getting 1 and a 0.4 probability of getting zero. Interest rates are zero. What is the option worth today?

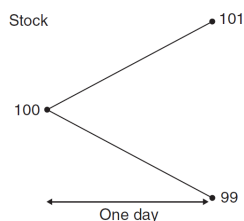


Figure 3.1 The stock can rise or fall over the next day, only two future prices are possible.

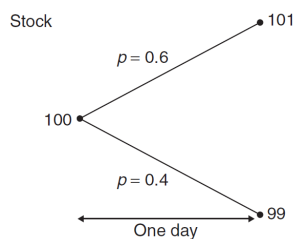


Figure 3.2 Probabilities associated with the future stock prices.

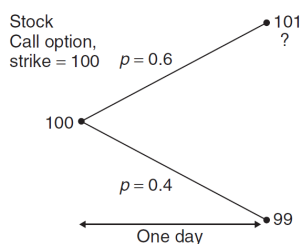
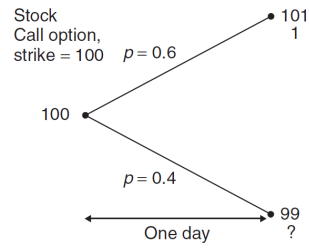


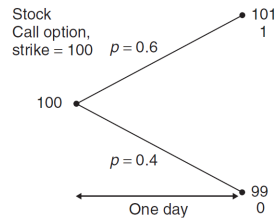
Figure 3.3 What is the option payoff if the stock rises?

It's  $\frac{1}{2}$ . To see this we must construct a portfolio consisting of one option and short  $\frac{1}{2}$  of the underlying stock, shown in Figure 3.7. If the stock rises to 101 then this portfolio is worth  $1 - \frac{1}{2} \times 101$ ; the one

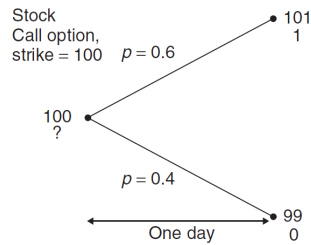




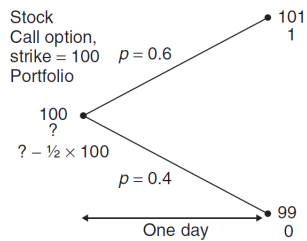
**Figure 3.4** What is the option payoff if the stock falls?



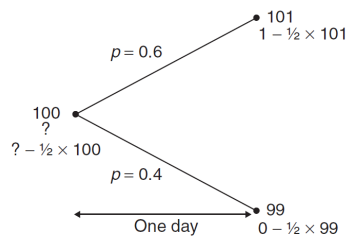
**Figure 3.5** Now we know the option values in both 'states of the world.'



**Figure 3.6** What is the option worth today?



**Figure 3.7** Long one option, short half of the stock.



**Figure 3.8** The portfolio values at expiration.

being from the option payoff and the  $-\frac{1}{2} \times 101$  being from a short  $(-)$  position  $(\frac{1}{2})$  in the stock (now worth 101). If the stock falls to 99 then this portfolio is worth  $0 - \frac{1}{2} \times 99$ ; the zero being from the option payoff and the  $-\frac{1}{2} \times 99$  being from a short  $(-)$  position  $(\frac{1}{2})$  in the stock (now worth 99), shown in Figure

3.8. In either case, tomorrow, at expiration, the portfolio takes the value  $-\frac{99}{2}$ . If the portfolio is worth  $-\frac{99}{2}$  tomorrow regardless of whether the stock rises or falls and interest rates are zero, then it must also be worth  $-\frac{99}{2}$  today. This is a perfectly risk-free portfolio and an example of **no arbitrage**: There are two ways to ensure that we have  $\frac{99}{2}$  tomorrow. 1) Buy one option and sell one half of the stock. 2) Put the money under the mattress. Both ‘portfolios’ must be worth the same today. Therefore

$$\begin{aligned} \text{the option value} - \frac{1}{2} \times 100 &= -\frac{1}{2} \times 99 \\ \text{the option value} &\implies \frac{1}{2} \end{aligned} \quad (20)$$

### WHY SHOULD THIS "THEORETICAL PRICE" BE THE "MARKET PRICE"?

If the theoretical price and the market price are not the same, then there is risk-free money to be made. If the option costs less than 0.5 simply buy it and hedge to make a profit. If it is worth more than 0.5 in the market then sell it and hedge, and make a guaranteed profit. In practice this arbitrage opportunity will make the option price converge to 0.5 due to supply and demand.

The expected payoff is 0.6 for this option. If you’re willing to pay 0.6 or more, then you’re **risk seeking**. If you’re paying 0.55, the expected return would be  $(0.6 - 0.55)/0.55 \approx 9\%$ . and the option writer stands to guarantee a profit of 0.05.

### HOW DID I KNOW TO SELL $\frac{1}{2}$ OF THE STOCK FOR HEDGING?

Let  $\Delta$  = quantity of stock that must be sold for hedging. Starting with one option,  $-\Delta$  of the stock gives a portfolio value of  $(? - \Delta \times 100)$ . Tomorrow the portfolio is worth  $(1 - \Delta \times 100)$  or  $(0 - \Delta \times 100)$  if the stock rises or falls respectively. Equating these two gives

$$1 - \Delta \times 101 = 0 - \Delta \times 99 \quad (21)$$

$$\implies \Delta = 0.5 \quad (22)$$

Another example: Stock price is 100, can rise to 103 or fall to 98. Value a call option with a strike price of 100. Interest rates are zero. The portfolio value is  $(? - \Delta \times 100)$ . Tomorrow the portfolio is either worth  $(3 - \Delta \times 103)$  or  $(0 - \Delta \times 98)$ . Hence

$$\Delta = \frac{3 - 0}{103 - 98} = \frac{3}{5} = 0.6. \quad (23)$$

The portfolio value tomorrow is then  $-0.6 \times 98$ . With zero interest rate, the portfolio value today must equal the risk-free portfolio value tomorrow:

$$? - 0.6 \times 100 = -0.6 \times 98 \implies ? = 1.2 \quad (24)$$

**Delta hedging** means choosing  $\Delta$  such that the portfolio value does not depend on the direction of the stock. Generalising this we have

$$\Delta = \frac{\text{Range of option payoffs}}{\text{Range of stock prices}}. \quad (25)$$

Where  $\Delta$  can be thought as the sensitivity of the option to changes in the stock.

### HOW DOES THIS CHANGE IF INTEREST RATES ARE NON-ZERO?

We delta hedge as before to construct risk-free portfolio with the same delta. Then present value that back in time, by multiplying a discount factor. Example: Same as first example, but now  $r = 0.1$ . The discount factor for going back one day is

$$\frac{1}{1 + 0.1/252} = 0.9996. \quad (26)$$

The portfolio value today must be the present value of the portfolio value tomorrow

$$\begin{aligned} ? - 0.5 \times 100 &= -0.5 \times 99 \times 0.9996. \\ ? &\implies 0.51963 \end{aligned} \quad (27)$$

### THE REAL AND RISK-NEUTRAL WORLDS

Some properties of the real world:

- We know all about delta hedging and risk elimination.
- We are very sensitive to risk, and expect greater return for taking risk.
- It turns out that only the two stock prices matter for option pricing, not the probabilities.

The **risk-neutral world** is one where people don't care about risk, and has the following properties:

- We don't care about risk, and don't expect any extra return for taking unnecessary risk.
- We don't ever need statistics for estimating probabilities of events happening.
- We believe that everything is priced using simple expectations.

Suppose in a risk-neutral world a stock is currently worth \$100 and could rise/fall to \$101/\$99. If the stock is correctly priced using expectations, the probabilities of the stock price rising or falling should just be 50/50 due to symmetry. On this risk-neutral world the **risk-neutral probabilities**  $p'$  is calculated from

$$p' \times 101 + (1 - p') \times 99 = 100 \quad (28)$$

This gives  $p' = 0.5$ . The calculation however is wrong to only use simple expectations for pricing with no allowance made for risk. The real probabilities are still 60% and 40% and hence  $p'$  is not real. In the same world, the call option will be valued by simple expectations with no regard to risk with

$$0.5 \times 1 + 0.5 \times 0 = 0.5 \quad (29)$$

This is called **risk-neutral expectation**.

When interest rates are non-zero we must perform exactly the same operations, but whenever we equate values at different times we must allow for present valuing. With  $r = 0.1$  we calculate the risk-neutral probabilities from

$$\begin{aligned} 0.9996 \times (p' \times 101 + (1 - p') \times 99) &= 100. \\ \implies p' &= 0.51984 \end{aligned} \quad (30)$$

The expected payoff is

$$0.51984 \times 1 + (1 - 0.51984) \times 0 = 0.51984 \quad (31)$$

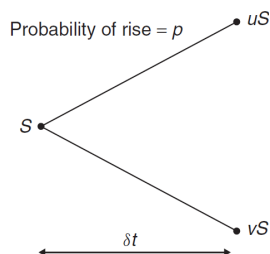
Its present(option) value is

$$0.9996 \times 0.51984 = 0.51963 \quad (32)$$

The risk-neutral probability  $p'$  that we have just calculated (the 0.5 in the first example) is not real, it does not exist, it is a mathematical construct.

### AND NOW USING SYMBOLS

During a time step  $\delta t$ , assume a binomial modelled asset which initially has the value  $S$  can either rise to a value  $u \times S$  or fall to a value  $v \times S$  with  $0 < v < 1 < u$  and probability of rise and fall are  $p$  and  $1 - p$  respectively. The three constants  $u, v$  and  $p$  are chosen to give the binomial walk the same characteristics as the asset we are modelling.



**Figure 3.20** The model, using symbols.

Let  $\mu$  be the drift of the asset and  $\sigma$  the volatility. The drift is the average rate at which the asset rises and the volatility is a measure of its randomness. Let the expressions of  $u, v$  and  $p$  for now be

$$u = 1 + \sigma\sqrt{\delta t} \quad (33)$$

$$v = 1 - \sigma\sqrt{\delta t} \quad (34)$$

$$p = \frac{1}{2} + \frac{\mu\sqrt{\delta t}}{2\sigma} \quad (35)$$

### Average asset change

The expected asset price after one time step is

$$\begin{aligned} puS + (1-p)vS &= \left(\frac{1}{2} + \frac{\mu\sqrt{\delta t}}{2\sigma}\right)(1 + \sigma\sqrt{\delta t})S + \left(\frac{1}{2} - \frac{\mu\sqrt{\delta t}}{2\sigma}\right)(1 - \sigma\sqrt{\delta t})S \\ &= S + S\mu\delta t \\ &= (1 + \mu\delta t)S \end{aligned} \quad (36)$$

Hence the expected change in asset is  $\mu S\delta t$  and the expected **return** is  $\mu\delta t$ .

### Standard deviation of asset price change

$$\begin{aligned} \frac{\sum (x_i - \bar{x})^2}{n-1} &= p(uS - (1 + \mu\delta t)S)^2 + (1-p)(vS - (1 + \mu\delta t)S)^2 \\ &= S^2 \left( p(u - 1 - \mu\delta t)^2 + (1-p)(v - 1 - \mu\delta t)^2 \right) \\ &= S^2 \left( \left(\frac{1}{2} + \frac{\mu\sqrt{\delta t}}{2\sigma}\right)(1 + \sigma\sqrt{\delta t} - 1 - \mu\delta t)^2 + \left(\frac{1}{2} - \frac{\mu\sqrt{\delta t}}{2\sigma}\right)(1 - \sigma\sqrt{\delta t} - 1 - \mu\delta t)^2 \right) \\ &= S^2 \left( \left(\frac{1}{2} + \frac{\mu\sqrt{\delta t}}{2\sigma}\right)(\sigma\sqrt{\delta t} - \mu\delta t)^2 + \left(\frac{1}{2} - \frac{\mu\sqrt{\delta t}}{2\sigma}\right)(\sigma\sqrt{\delta t} + \mu\delta t)^2 \right) \\ &= S^2 \left( \left(\frac{1}{2} + \frac{\mu\sqrt{\delta t}}{2\sigma}\right)(\sigma^2\delta t - 2\mu\sigma\delta t^{\frac{3}{2}} + \mu^2\delta t^2) + \left(\frac{1}{2} - \frac{\mu\sqrt{\delta t}}{2\sigma}\right)(\sigma^2\delta t + 2\mu\sigma\delta t^{\frac{3}{2}} + \mu^2\delta t^2) \right) \\ &= S^2(\sigma^2\delta t - \mu^2\delta t^2) \end{aligned} \quad (37)$$

Hence the standard deviation of asset changes and returns are approximately  $S\sigma\sqrt{\delta t}$  and  $\sigma\sqrt{\delta t}$ .

### AN EQUATION FOR THE VALUE OF AN OPTION

At time  $t$  a portfolio consisting of one option and a short position in a quantity  $\Delta$  of the underlying has value

$$\Gamma = V - \Delta S \quad (38)$$

At time  $t + \delta t$  the asset can rise or fall with values of either  $V^+$  or  $V^-$ . Hence the portfolio value is either  $V^+ - \Delta uS$  or  $V^- - \Delta vS$ .

#### Hedging

Having the freedom to choose  $\Delta$ , we can make the value of this portfolio the same whether the asset rises or falls. This is ensured if we make

$$\begin{aligned} V^+ - \Delta uS &= V^- - \Delta vS \\ \implies \Delta &= \frac{V^+ - V^-}{(u - v)S} \end{aligned} \quad (39)$$

Substituting in  $\Delta$ , the portfolio value value if the stock rises or falls is then respectively

$$\begin{aligned} V^+ - \Delta uS &= V^+ - \frac{u(V^+ - V^-)}{(u - v)} \\ V^- - \Delta vS &= V^- - \frac{v(V^+ - V^-)}{(u - v)} \end{aligned} \quad (40)$$

#### No arbitrage

Let the original portfolio value plus its change in value be

$$\Pi + \delta\Pi \quad (41)$$

where  $\delta\Pi$  is the interest earned at the risk-free rate,

$$\delta\Pi = r\Pi\delta t \quad (42)$$

Hence

$$\begin{aligned} \Pi + \delta\Pi &= \Pi + r\Pi\delta t \\ &= \Pi(1 + r\delta t) \\ &= V^- - \frac{v(V^+ - V^-)}{(u - v)} \end{aligned} \quad (43)$$

$$\begin{aligned} \Pi &= V - \Delta S \\ &= V - \frac{(V^+ - V^-)}{(u - v)} \end{aligned} \quad (44)$$

$$\begin{aligned} \implies \Pi(1 + r\delta t) &= V^- - \frac{v(V^+ - V^-)}{(u - v)} \\ (1 + r\delta t) \left( V - \frac{(V^+ - V^-)}{(u - v)} \right) &= \frac{V^-(u - v) - v(V^+ - V^-)}{(u - v)} \\ (1 + r\delta t)V - (1 + r\delta t) \frac{(V^+ - V^-)}{(u - v)} &= \frac{uV^- - vV^- - vV^+ + vV^-}{(u - v)} \\ (1 + r\delta t)V &= (1 + r\delta t) \frac{(V^+ - V^-)}{(u - v)} + \frac{uV^- - vV^+}{(u - v)} \end{aligned} \quad (45)$$

This is an equation for  $V$  given  $V^+$ , and  $V^-$ , the option values at the next time step, and the parameters  $u$  and  $v$  describing the random walk of the asset. Using  $u = 1 + \sigma\sqrt{\delta t}$  and  $v = 1 - \sigma\sqrt{\delta t}$ , this can be rewritten as

$$\begin{aligned} V &= \frac{1}{1 + r\delta t} \left( \frac{(1 + r\delta t)(V^+ - V^-)}{1 + \sigma\sqrt{\delta t} - 1 + \sigma\sqrt{\delta t}} + \frac{(1 + \sigma\sqrt{\delta t})V^- - (1 - \sigma\sqrt{\delta t})V^+}{1 + \sigma\sqrt{\delta t} - 1 + \sigma\sqrt{\delta t}} \right) \\ &= \frac{1}{1 + r\delta t} \left( \frac{V^+ - V^- + V^+r\delta t - V^-r\delta t}{2\sigma\sqrt{\delta t}} + \frac{V^- + V^- \sigma\sqrt{\delta t} - V^+ + V^+ \sigma\sqrt{\delta t}}{2\sigma\sqrt{\delta t}} \right) \\ &= \frac{1}{1 + r\delta t} \left( \frac{V^+r\delta t - V^-r\delta t + V^- \sigma\sqrt{\delta t} + V^+ \sigma\sqrt{\delta t}}{2\sigma\sqrt{\delta t}} \right) \\ &= \frac{1}{1 + r\delta t} \left( \frac{V^+r\sqrt{\delta t} - V^-r\sqrt{\delta t} + V^- \sigma + V^+ \sigma}{2\sigma} \right) \\ &= \frac{1}{1 + r\delta t} \left[ \left( \frac{r\sqrt{\delta t} + \sigma}{2\sigma} \right) V^+ + \left( \frac{\sigma - r\sqrt{\delta t}}{2\sigma} \right) V^- \right] \\ &= \frac{1}{1 + r\delta t} \left[ \left( \frac{1}{2} + \frac{r\sqrt{\delta t}}{2\sigma} \right) V^+ + \left( \frac{1}{2} - \frac{r\sqrt{\delta t}}{2\sigma} \right) V^- \right] \\ &= \frac{1}{1 + r\delta t} (p'V^+ + (1 - p')V^-) \end{aligned} \quad (46)$$

where

$$p' = \frac{1}{2} + \frac{r\sqrt{\delta t}}{2\sigma} \quad (47)$$

If only the expression contained  $p$ , the real probability of a stock rise, then this expression would be the expected value at the next time step. But since  $p$  did not appear in Equation (46), the probability of a rise or fall is irrelevant as far as option pricing is concerned. Comparing the the expression for  $p'$  with the expression for the actual probability  $p$ :

$$\begin{aligned} p' &= \frac{1}{2} + \frac{r\sqrt{\delta t}}{2\sigma} \\ p &= \frac{1}{2} + \frac{\mu\sqrt{\delta t}}{2\sigma} \end{aligned} \quad (48)$$

The expressions differ by either interest rate  $r$  or drift  $\mu$ .  $p'$  is the **risk-neutral probability**. It's like the real probability, but the real probability if the drift rate were  $r$  instead of  $\mu$ . Observe that the risk-free interest rate plays two roles in option valuation. It's used once for discounting to give present value, and it's used as the drift rate in the risk-neutral asset price random walk. Interpreting  $p'$  as a probability, Eq.(3.3) is the statement that the option value at any time is the present value of the risk-neutral expected value at any later time. Under the risk neutrality assumption, today's fair price of a derivative is equal to the expected value of its future payoff discounted by the risk free rate.

### **THE BINOMIAL TREE**

The binomial tree model, allows a stock with value  $S$  to move up to  $uS$  or down to  $vS$  after next time step. After two time steps, the asset will be either  $u^2S$  (up-up),  $uvS$  (up-down) or  $v^2S$  (down-down). Extending this random walk until expiry results in a **binomial tree** structure, shown in Fig 3.22. The

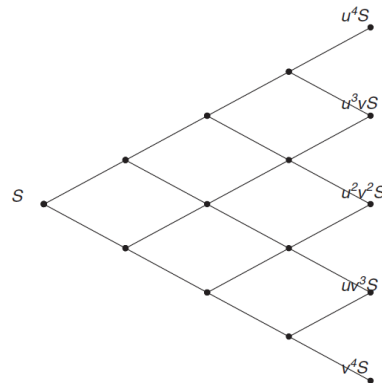


Figure 3.22 The binomial tree: a schematic version.

top and bottom branches of the tree at expiry can only be reached by one path each, either all up or all down moves. Whereas there will be several paths possible for each of the intermediate values at expiry. Therefore the intermediate values are more likely to be reached than the end values if one were doing a simulation. The binomial tree therefore contains within it an approximation to the probability density function for the lognormal random walk.

### **THE ASSET PRICE DISTRIBUTION**

The probability of reaching a particular node in the binomial tree depends on the number of distinct paths to that node and the probabilities of the up and down moves. Since up and down moves are approximately equally likely and since there are more paths to the interior prices than to the two extremes we will find that the probability distribution of future prices is roughly bell shaped. In Figure 3.23 is shown the number of paths to each node after four time steps and the probability of getting to each. In Figure 3.24 this is interpreted as probability density functions at a sequence of times.

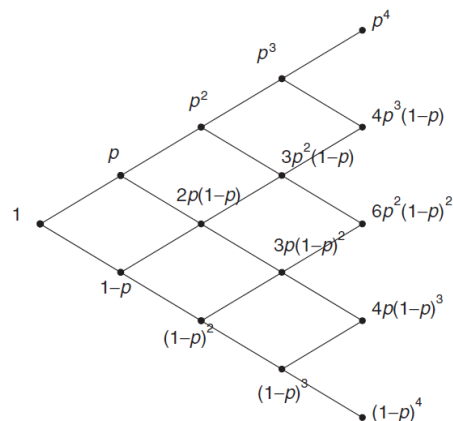


Figure 3.23 Counting paths.

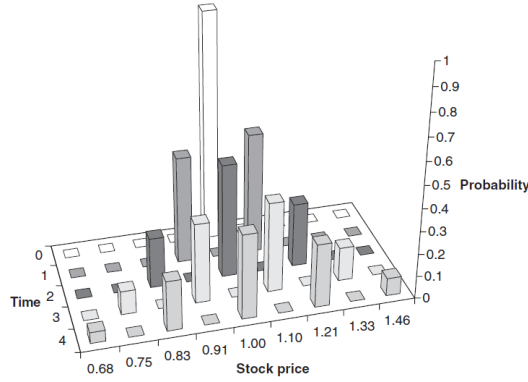


Figure 3.24 The probability distribution of future asset prices.

### VALUING BACK DOWN THE TREE

We know  $V^+$  and  $V^-$  at expiry, time  $T$ , because we know the option value as a function of the asset i.e. the payoff function. Knowing the value of the option at expiry we can find the option value at time  $T - \delta t$  for all values of  $S$  on the tree and all the other values of  $S$  of the previous time steps until the beginning. Here  $S = 100$ ,  $\delta t = 1/12$ ,  $r = 0.1$  and  $\sigma = 0.2$ . The option is a European call with a strike of 100 and four months to expiration. Using these numbers we have  $u = 1.0604$ ,  $v = 0.9431$  and  $p' = 0.5567$ . As an example, after one time step the asset takes either the value  $100 \times 1.0604 = 106.04$  or  $100 \times 0.9431 = 94.31$ . Working back from expiry, the option value at the time step before expiry when  $S = 119.22$  is given by

$$e^{-0.1 \times 0.0833} (0.5567 \times 26.42 + (1 - 0.5567) \times 12.44) = 20.05. \quad (49)$$

Working right back down the tree to the present time, the option value when the asset is 100 is 6.13.

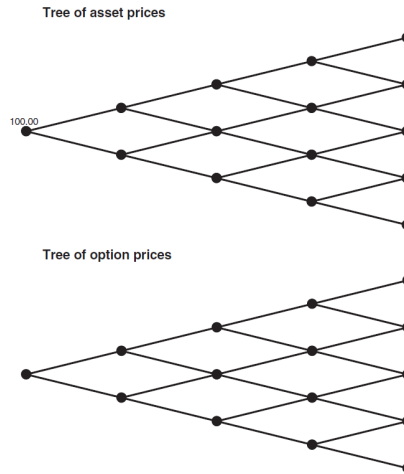


Figure 3.25 The two trees, asset and option.

### THE GREEKS

The greeks are defined as derivatives of the option value with respect to various variables and parameters. From the binomial model the option's delta is defined by

$$\frac{V^+ - V^-}{(u - v)S}. \quad (50)$$

The delta uses the option value at the two points marked 'D' together with today's asset price and the parameters  $u$  and  $v$ . In the limit as the time step approaches zero, the delta becomes

$$\frac{\partial V}{\partial S} \quad (51)$$

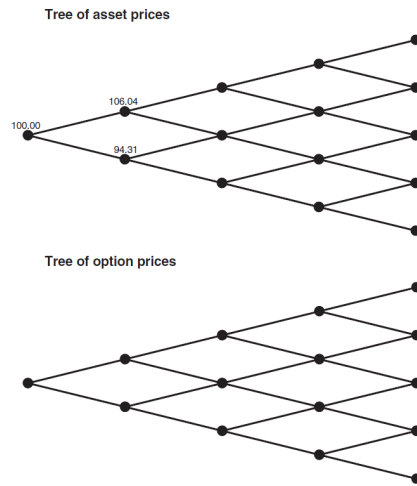


Figure 3.26 Start building up the stock-price tree.

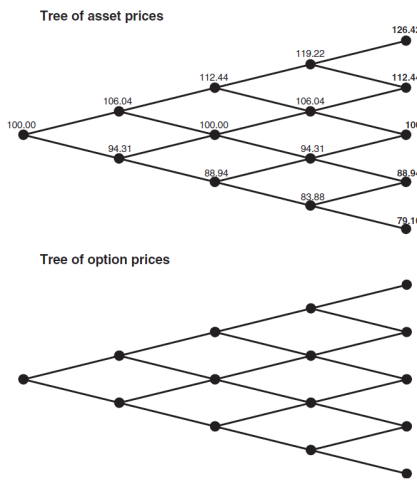


Figure 3.27 The finished stock tree.

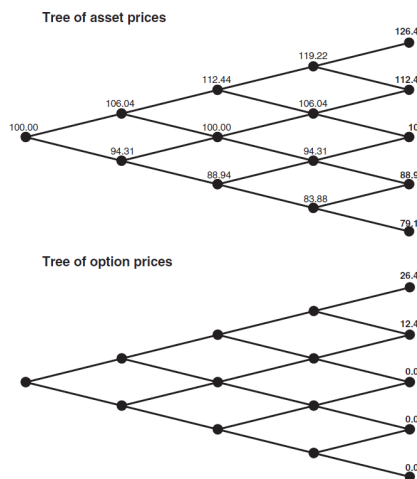


Figure 3.28 The option payoff.

The gamma of the option is defined as a derivative of the option with respect to the underlying, representing the sensitivity of the delta to the asset

$$\frac{\partial^2 V}{\partial S^2}. \quad (52)$$



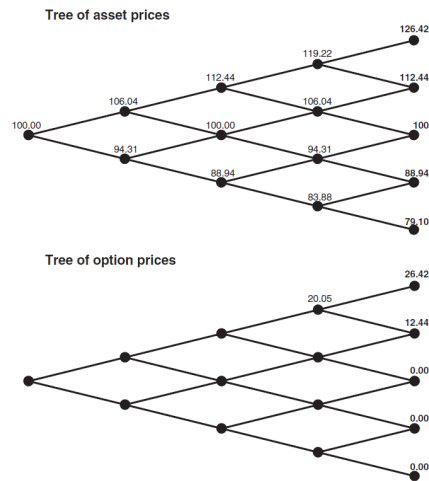


Figure 3.29 Work backwards one 'node' at a time.

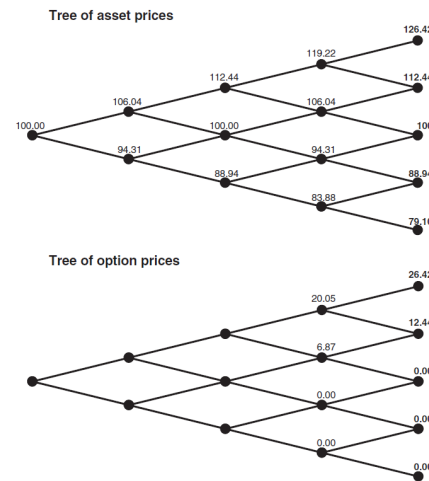


Figure 3.30 First time step completed.

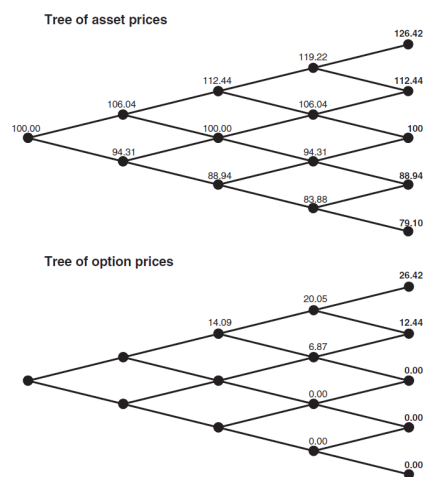


Figure 3.31 Starting on next time step.

It is a measure of how much we must hedge at next time step. We can calculate the delta at points marked with a D in Figure 3.34 from the option value one time step further in the future. The gamma is then just the change in the delta from one of these to the other divided by the distance between them.

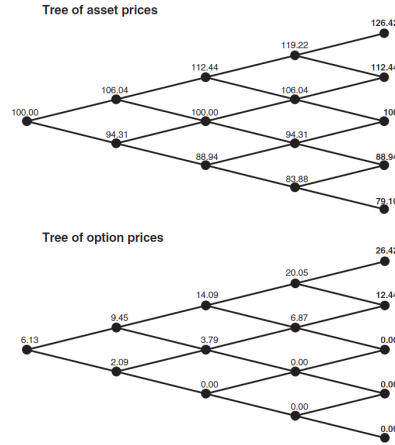


Figure 3.32 The finished option-price tree. Today's option price is therefore 6.13.

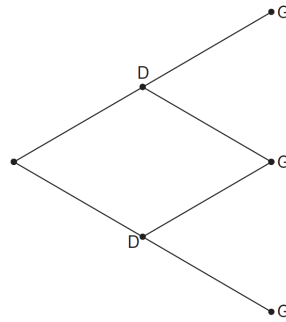


Figure 3.34 Calculating the delta and gamma.

This calculation uses the points marked 'G' in Figure 3.34.

The theta of the option is the sensitivity of the option price to time, assuming that the asset price does not change. An obvious choice for the discrete-time definition of theta is to interpolate between  $V^+$  and  $V^-$  to find a theoretical option value had the asset not changed and use this to estimate

$$\frac{\partial V}{\partial t}, \quad (53)$$

which results in

$$\frac{\frac{1}{2}(V^+ + V^-) - V}{\delta t}. \quad (54)$$

The vega is the sensitivity of the option value to the volatility

$$\frac{\partial V}{\partial \sigma}. \quad (55)$$

Suppose we want to find the option value and vega when the volatility is 20%. The most efficient way to do this is to calculate the option price twice, using a binomial tree, with two different values of  $\sigma$ . Calculate the option value using a volatility of  $\sigma \pm \epsilon$ , for a small number  $\epsilon$ ; call the values you find  $V_{\pm}$ . The option value is approximated by the average value

$$V = \frac{1}{2}(V_+ + V_-) \quad (56)$$

and the vega is approximated by

$$\frac{V_+ - V_-}{2\epsilon}. \quad (57)$$

## EARLY EXERCISE

We use the same binomial tree with the same  $u, v$  and  $p$  with a slight difference in  $V$ . We must ensure that there are no arbitrage opportunities at any of the nodes. Let  $S_j^n$  be the asset price at the  $n$ th time step, at the node  $j$  from the bottom,  $0 \leq j \leq n$ . In our lognormal world we have

$$S_j^n = Su^j v^{n-j} \quad (58)$$

where  $S$  is the current asset price. Let  $V_j^n$  be the option value at the same node. Our ultimate goal is to find  $V_0^0$  knowing the payoff, i.e. knowing  $V_j^M$  for all  $0 \leq j \leq M$  where  $M$  is the number of time steps. Here arbitrage is possible if the theoretical option value goes below the payoff at any time and it's time to exercise. If we find that

$$\frac{V_{j+1}^{n+1} - V_j^{n+1}}{u - v} + \frac{1}{1 + r\delta t} \frac{uV_j^{n+1} - vV_{j+1}^{n+1}}{u - v} \geq \text{Payoff}(S_j^n) \quad (59)$$

then we use this as our new value. But if

$$\frac{V_{j+1}^{n+1} - V_j^{n+1}}{u - v} + \frac{1}{1 + r\delta t} \frac{uV_j^{n+1} - vV_{j+1}^{n+1}}{u - v} < \text{Payoff}(S_j^n) \quad (60)$$

then we should exercise, giving us a better value of

$$V_j^n = \text{Payoff}(S_j^n). \quad (61)$$

Putting two together we get

$$V_j^n = \max \left( \frac{V_{j+1}^{n+1} - V_j^{n+1}}{u - v} + \frac{1}{1 + r\delta t} \frac{uV_j^{n+1} - vV_{j+1}^{n+1}}{u - v}, \text{Payoff}(S_j^n) \right) \quad (62)$$

### **THE CONTINUOUS TIME LIMIT**

The binomial model is a discrete-time model that can lead to the Black-Scholes equation which is in continuous time. Examine

$$V = \frac{1}{1 + r\delta t} (p'V^+ + (1 - p')V^-) \quad (63)$$

as  $\delta t \rightarrow 0$ , we have

$$\begin{aligned} u &\sim 1 + \sigma\sqrt{\delta t}, \\ v &\sim 1 - \sigma\sqrt{\delta t} \end{aligned} \quad (64)$$

Next we write

$$\begin{aligned} V &= V(S, t) \\ V^+ &= V(uS, t + \delta t) \\ V^- &= V(vS, t + \delta t) \end{aligned} \quad (65)$$

Expanding these expressions in Taylor series

$$V(S + \delta S, t + \delta t) \approx V(S, t) + \delta t \frac{\partial V}{\partial t} + \delta S \frac{\partial V}{\partial S} + \frac{1}{2} \delta S^2 \frac{\partial^2 V}{\partial S^2} + \dots \quad (66)$$

we get

$$\begin{aligned} V^+ &= V(uS, t + \delta t) \\ &= V(S + S(u - 1), t + \delta t) \\ &= V(S, t + \delta t) + \frac{\partial V(S, t + \delta t)}{\partial S} S(u - 1) + \frac{1}{2} \frac{\partial^2 V(S, t + \delta t)}{\partial S^2} S^2(u - 1)^2 + O(u^3) \end{aligned} \quad (67)$$

$$\begin{aligned} V^- &= V(vS, t + \delta t) \\ &= V(S + S(v - 1), t + \delta t) \\ &= V(S, t + \delta t) + \frac{\partial V(S, t + \delta t)}{\partial S} S(v - 1) + \frac{1}{2} \frac{\partial^2 V(S, t + \delta t)}{\partial S^2} S^2(v - 1)^2 + O(v^3) \end{aligned} \quad (68)$$

$$\begin{aligned}
p'V^+ + (1-p')V^- &= p' \left( V + \frac{\partial V}{\partial S} S(u-1) + \frac{1}{2} \frac{\partial^2 V}{\partial S^2} S^2(u-1)^2 + O(u^3) \right) \\
&\quad + (1-p') \left( V + \frac{\partial V}{\partial S} S(v-1) + \frac{1}{2} \frac{\partial^2 V}{\partial S^2} S^2(v-1)^2 + O(v^3) \right) \\
&= p'V + p' \frac{\partial V}{\partial S} S(u-1) + p' \frac{1}{2} \frac{\partial^2 V}{\partial S^2} S^2(u-1)^2 + V + \frac{\partial V}{\partial S} S(v-1) \\
&\quad + \frac{1}{2} \frac{\partial^2 V}{\partial S^2} S^2(v-1)^2 - p'V - p' \frac{\partial V}{\partial S} S(v-1) - p' \frac{1}{2} \frac{\partial^2 V}{\partial S^2} S^2(v-1)^2 \\
&= V + \frac{\partial V}{\partial S} S(p'(u-1) + (v-1) - p'(v-1)) + \frac{1}{2} \frac{\partial^2 V}{\partial S^2} S^2(u-1)^2 + O(u^3) \\
&= V + \frac{\partial V}{\partial S} S(p'(u-1) + (1-p')(v-1)) + \frac{1}{2} \frac{\partial^2 V}{\partial S^2} S^2(u-1)^2 + O(u^3)
\end{aligned} \tag{69}$$

For the binomial random walk to have the correct drift over a time period of  $\delta t$  we need

$$\begin{aligned}
puS + (1-p)vS &= SE \left[ e^{(\mu - \frac{1}{2}\sigma^2)\delta t + \sigma\phi\sqrt{\delta t}} \right] = Se^{\mu\delta t} \\
\implies pu + (1-p)v &= e^{\mu\delta t}
\end{aligned} \tag{70}$$

Putting it all together, we have

$$V = \frac{1}{1+r\delta t} (p'V^+ + (1-p')V^-) \tag{71}$$

$$\begin{aligned}
\implies V(1+r\delta t) &= V + \frac{\partial V}{\partial S} S(p'(u-1) + (1-p')(v-1)) + \frac{1}{2} \frac{\partial^2 V}{\partial S^2} S^2(u-1)^2 + O(u^3) \\
&= V + \frac{\partial V}{\partial S} S(p'u - p' + v - 1 - p'v + p') + \frac{1}{2} \frac{\partial^2 V}{\partial S^2} S^2(u-1)^2 + O(u^3) \\
&= V + \frac{\partial V}{\partial S} S(p'u + (1-p')v - 1) + \frac{1}{2} \frac{\partial^2 V}{\partial S^2} S^2(u-1)^2 + O(u^3) \\
&= V + \frac{\partial V}{\partial S} S(e^{\mu\delta t} - 1) + \frac{1}{2} \frac{\partial^2 V}{\partial S^2} S^2(u-1)^2 + O(u^3) \\
&= V + \frac{\partial V}{\partial S} Sr\delta t + \frac{1}{2} \frac{\partial^2 V}{\partial S^2} S^2\sigma^2\delta t + O(u^3)
\end{aligned} \tag{72}$$

We end up with

$$V(S, 0) + r\delta t V(S, 0) = V(S, \delta t) + Sr\delta t \frac{\partial V(S, \delta t)}{\partial S} + \frac{1}{2} S^2 \sigma^2 \delta t \frac{\partial^2 V(S, \delta t)}{\partial S^2} \tag{73}$$

$$\begin{aligned}
\implies 0 &= V(S, \delta t) - V(S, 0) + Sr\delta t \frac{\partial V(S, \delta t)}{\partial S} + \frac{1}{2} S^2 \sigma^2 \delta t \frac{\partial^2 V(S, \delta t)}{\partial S^2} - r\delta t V(S, 0) \\
&= \frac{V(S, \delta t) - V(S, 0)}{\delta t} + Sr \frac{\partial V(S, \delta t)}{\partial S} + \frac{1}{2} S^2 \sigma^2 \frac{\partial^2 V(S, \delta t)}{\partial S^2} - rV(S, 0)
\end{aligned} \tag{74}$$

Taking the limit of  $\delta t \rightarrow 0$ , we finally arrive at the Black-Scholes equation

$$0 = \frac{\partial V(S, 0)}{\partial t} + Sr \frac{\partial V(S, 0)}{\partial S} + \frac{1}{2} S^2 \sigma^2 \frac{\partial^2 V(S, 0)}{\partial S^2} - rV(S, 0) \tag{75}$$

$$\implies \frac{\partial V}{\partial t} + \frac{1}{2} S^2 \sigma^2 \frac{\partial^2 V}{\partial S^2} + rS \frac{\partial V}{\partial S} - rV = 0 \tag{76}$$

## 0.4 Chapter 4: The Random Behaviour of Assets

### THE POPULAR FORMS OF “ANALYSIS”

Three forms of analysis:

Fundamental Analysis

- Trying to determine the ‘correct’ worth of a company by an in-depth study of balance sheets, management teams, patent applications, competitors, lawsuits, etc.
- Two difficulties:
  - Difficult, and all the most important stuff can be hidden ‘off balance sheet.’
  - ‘The market can stay irrational longer than you can stay solvent’ (Keynes). In other words, even if you have the perfect model for the value of a firm it doesn’t mean you can make money. You have to find some mispricing and then hope that the rest of the world starts to see your point of view. And this may never happen.

Technical Analysis

- You don’t care anything about the company other than the information contained within its stock price history.
- You draw trendlines, look for specific patterns in the share price and make predictions accordingly.

Quantitative Analysis

- Treating financial quantities such as stock prices or interest rates as random, and then choosing the best models for that randomness.

### WHY WE NEED A MODEL FOR RANDOMNESS: JENSEN’S INEQUALITY

Jensen’s inequality allows us to see the importance of randomness in option theory. Suppose a stock worth 100 today could equally likely be 50 or 150 in one year’s time. How can we value an option on this stock, a call option with a strike of 100 expiring in one year? First scenario: We say that that we

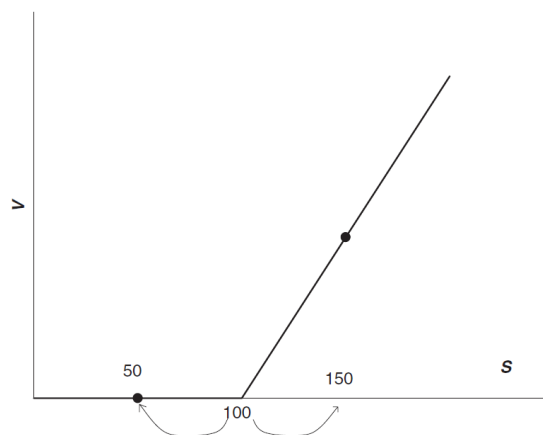


Figure 4.1 Future scenarios.

expect the stock price to be at 100 in one year, this being the average of the possible future values. The payoff for the call option would then be 0, since it is exactly at the money. And the present value of this is zero. But you’d expect the value to be greater than zero, since half the time there is some payoff. Second scenario: Look at the two possible payoffs and then calculate that expectation. If the stock falls to 50 then the payoff is zero, if it rises to 150 then the payoff is 50. The average payoff is therefore 25, which we could present value to give us some idea of the option’s value. This calculation illustrates that the order in which we do the payoff calculation and the expectation matters. In this example we had

$$\text{Payoff}(\text{Expected}[\text{stock price}]) = 0 \quad (77)$$

whereas

$$\text{Expected}[\text{Payoff}(\text{stock price})] = 25 \quad (78)$$

This is an example of Jensen's inequality. For a convex function  $f(S)$  (payoff function of a call) of a random variable  $S$  (stock price),

$$E[f(S)] \geq f(E[S]) \quad (79)$$

Let

$$S = \bar{S} + \epsilon \quad (80)$$

where  $\bar{S} = E[S]$ , so the  $E[\epsilon] = 0$ . Then

$$\begin{aligned} E[f(S)] &= E[f(\bar{S} + \epsilon)] \\ &= E\left[f(\bar{S}) + \epsilon f'(\bar{S}) + \frac{1}{2}\epsilon^2 f''(\bar{S}) + \dots\right] \\ &\approx f(\bar{S}) + \frac{1}{2}f''(\bar{S})E[\epsilon^2] \\ &= f(E[S]) + \frac{1}{2}f''(E[S])E[\epsilon^2]. \end{aligned} \quad (81)$$

So  $E[f(S)]$  is greater than  $f(E[S])$  by approximately

$$\frac{1}{2}f''(E[S])E[\epsilon^2]. \quad (82)$$

This shows the importance of two concepts:

- $f''(E[S])$ : The **convexity** of an option. As a rule this adds value to an option. It also means that any intuition we may get from linear contracts (forwards and futures) might not be helpful with non-linear instruments such as options.
- $E[\epsilon^2]$ : Randomness in the underlying, and its variance. As stated above, modeling randomness is the key to modeling options.

## SIMILARITIES BETWEEN EQUITIES, CURRENCIES, COMMODITIES AND INDICES

In investments we look for **return**, meaning the percentage growth in the value of an asset, together with accumulated dividends, over some period:

$$\text{Return} = \frac{\text{Change in value of the asset} + \text{accumulated cashflows}}{\text{Original value of the asset}} \quad (83)$$

When it comes to modelling assets, the returns are more important than actual stock price. For two stocks A and B that are worth respectively \$100 and \$1000 - both growing on average by \$10 per annum - will both have an absolute growth of \$10 and percentage growth of 10% and 1% respectively. Hence if we have \$1000 to invest we would be better off investing in ten of asset A than one of asset B.

### EXAMINING RETURNS

Figure 4.2 shows a typical plot of the quoted price of Perez Companac. It has a general upward trend that's not guaranteed. any mathematical model of a financial asset must acknowledge the randomness and have a probabilistic foundation. Remembering that the returns are more important to us than the absolute level of the asset price, I show in Figure 4.3 how to calculate returns on a spreadsheet. Let  $S_i$  be the  $i$ th day asset value. The return from day  $i$  to  $i + 1$  is given by (ignoring dividends)

$$\frac{S_{i+1} - S_i}{S_i} = R_i \quad (84)$$

Figure 4.4 shows the daily return for Perez Companac. It looks like 'noise' and will be modelled as such. The mean of the returns distribution is

$$\bar{R} = \frac{1}{M} \sum_{i=1}^M R_i \quad (85)$$

with sample standard deviation as

$$\sqrt{\frac{1}{M-1} \sum_{i=1}^M (R_i - \bar{R})^2} \quad (86)$$

where  $M$  is the number of returns in the sample (one fewer than the number of asset prices). From the data in this example we find that the mean is 0.002916 and the standard deviation is 0.024521.

asd

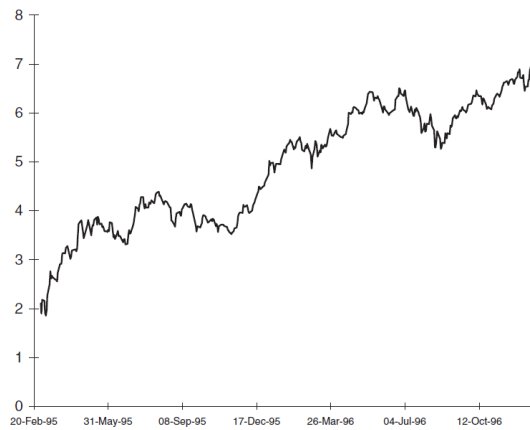


Figure 4.2 Perez Companc from February 1995 to November 1996.

Date	Perez	Return		
01-Mar-95	2.11		Average return	0.002916
02-Mar-95	1.90	-0.1	Standard deviation	0.024521
03-Mar-95	2.18	0.149906		
06-Mar-95	2.16	-0.01081		
07-Mar-95	1.91	-0.11258	=AVERAGE(C3:C463)	
08-Mar-95	1.86	-0.02985		
09-Mar-95	1.97	0.061538		
10-Mar-95	2.27	0.15	=STDEVP(C3:C463)	
13-Mar-95	2.49	0.099874		
14-Mar-95	2.76	0.108565		
15-Mar-95	2.61	-0.05426		
16-Mar-95	2.67	0.021858		
17-Mar-95	2.64	-0.0107		
20-Mar-95	2.60	-0.01622	=(B13-B12)/B12	
21-Mar-95	2.59	-0.00275		
22-Mar-95	2.59	-0.00275		
23-Mar-95	2.55	-0.01232		
24-Mar-95	2.73	0.069307		
27-Mar-95	2.91	0.064815		
28-Mar-95	2.92	0.002899		
29-Mar-95	2.92	0		
30-Mar-95	3.12	0.069364		
31-Mar-95	3.14	0.005405		
03-Apr-95	3.13	-0.00269		
04-Apr-95	3.24	0.037736		
05-Apr-95	3.25	0.002597		
06-Apr-95	3.28	0.007772		
07-Apr-95	3.21	-0.02057		
10-Apr-95	3.02	-0.06037		
11-Apr-95	3.08	0.019553		
12-Apr-95	3.19	0.035616		
17-Apr-95	3.21	0.007936		
18-Apr-95	3.17	-0.01312		
19-Apr-95	3.24	0.021277		

Figure 4.3 Spreadsheet for calculating asset returns.

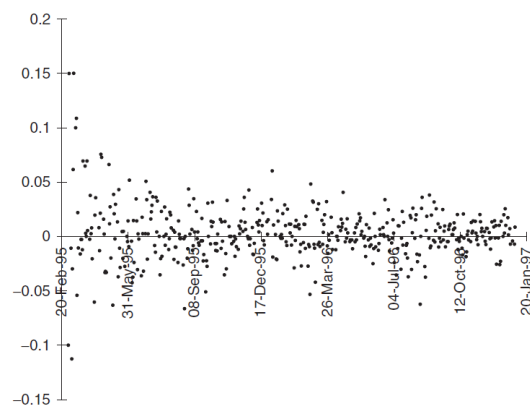


Figure 4.4 Daily returns of Perez Companc.