

# Financial Engineering & Risk Management

## Introduction to Term Structure Lattice Models

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# Fixed Income Markets

Fixed income markets are enormous and in fact bigger than equity markets. According to *SIFMA*, in Q3 2012 the total outstanding amount of US bonds was **\$35.3 trillion**:

Government	\$10.7	30.4%
Municipal	\$3.7	10.5%
Mortgage	\$8.2	23.3%
Corporate	\$8.6	24.3%
Agency	\$2.4	6.7%
Asset-backed	\$1.7	4.8%
Total	\$35.3 tr	100%

– in comparison, size of US **equity** markets is approx \$26 trillion.

Fixed income **derivatives** markets are also enormous

- includes interest-rate and bond derivatives, credit derivatives, MBS and ABS
- will focus here on interest-rate and bond derivatives
  - using **binomial lattice** models.

(The slides and Excel spreadsheet should be sufficient but Chapter 14 of Luenberger is an excellent reference for the material in this section.)

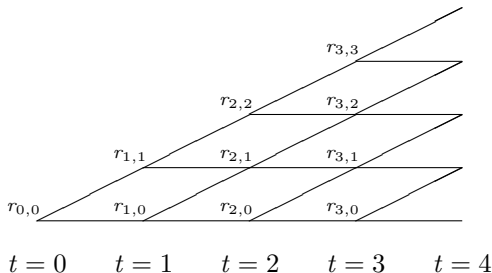
# Binomial Models for the Short Rate

- Will use binomial lattice models as our vehicle for introducing:
  1. the mechanics of the most important fixed income derivative securities
    - bond futures (and forwards)
    - caplets and caps, floorlets and floors
    - swaps and swaptions
  2. the "philosophy" behind fixed income derivatives pricing
    - more on this soon.
- Fixed-income models are inherently more complex than security models
  - need to model evolution of entire **term-structure of interest rates**.
- The **short-rate**,  $r_t$ , is the variable of interest in many fixed income models
  - including binomial lattice models
  - $r_t$  is the risk-free rate that applies between periods  $t$  and  $t + 1$
  - it is a **random process** but  $r_t$  is known by time  $t$ .

# The “Philosophy” of Fixed Income Derivatives Pricing

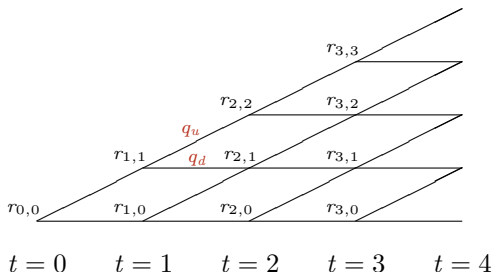
- We will simply specify **risk-neutral** probabilities for the short-rate,  $r_t$ 
  - without any reference to the **true** probabilities of the short-rate
- This is in contrast to the binomial model for stocks where we specified  $p$  and  $1 - p$ 
  - and then used replication arguments to obtain  $q$  and  $1 - q$ .
- We will price securities in such a way that **guarantees no-arbitrage**
- Will match market prices of liquid securities via a **calibration** procedure
  - often the most challenging part.
- Will see that derivatives pricing in practice is really about **extrapolating** from liquid security prices to illiquid security prices.

# Binomial Models for the Short-Rate



- We will take zero-coupon bond (zcb) prices to be our basic securities
  - will use  $Z_{i,j}^k$  for time  $i$ , state  $j$  price of a zcb that matures at time  $k$
- Would like to specify binomial model by specifying all  $Z_{i,j}^k$ 's at all nodes
  - possible but awkward if we want to ensure **no-arbitrage**.
- Instead will specify the **short-rate**,  $r_{i,j}$  at each node  $N_{i,j}$ 
  - the risk-free rate that applies to the next period.

# Binomial Models for the Short-Rate



- Let  $Z_{i,j}$  be the date  $i$ , state  $j$  price of a non-coupon paying security.
- Will use **risk-neutral** pricing to price every security so that:

$$Z_{i,j} = \frac{1}{1 + r_{i,j}} [q_u \times Z_{i+1,j+1} + q_d \times Z_{i+1,j}] \quad (1)$$

- where  $q_u$  and  $q_d$  are the risk-neutral probabilities of an up- and down-move
- so  $q_d + q_u = 1$  and must have  $q_d > 0$  and  $q_u > 0$ .
- There can be **no arbitrage** when we price using (3). Why?

# Binomial Models for the Short Rate

- If the security pays a “coupon”,  $C_{i+1,j}$ , at date  $i + 1$  and state  $j$  then

$$Z_{i,j} = \frac{1}{1 + r_{i,j}} [q_u (Z_{i+1,j+1} + C_{i+1,j+1}) + q_d (Z_{i+1,j} + C_{i+1,j})] \quad (2)$$

- where  $Z_{i+1,.}$  is now the **ex-coupon** price at date  $i + 1$ .
- If we use (3) or (2) to price securities in the lattice model then arbitrage is not possible
  - Regardless of what probabilities we use! Why is this?
- In fact it is very common to simply set  $q_u = q_d = 1/2$ 
  - and to **calibrate** other parameters to market prices.
- We will **assume**  $q_u = q_d = 1/2$  in our examples.

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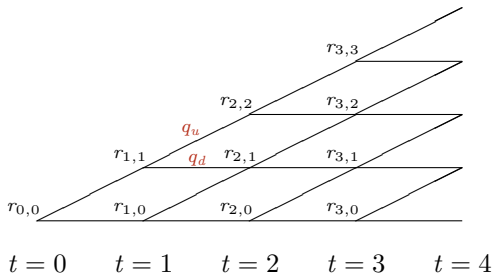
## The Cash Account and Pricing Zero-Coupon Bonds

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# Binomial Models for the Short-Rate



- We use **risk-neutral** pricing to price every non-coupon paying security:

$$Z_{i,j} = \frac{1}{1 + r_{i,j}} [q_u \times Z_{i+1,j+1} + q_d \times Z_{i+1,j}] \quad (3)$$

- $q_u > 0$  and  $q_d > 0$  are the risk-neutral probabilities of an up- and down-move, respectively, of the short-rate.

- There can be **no arbitrage** when we price using (3). Why?

# The Cash-Account

- The **cash-account** is a particular security that in each period earns interest at the short-rate
  - we use  $B_t$  to denote its value at time  $t$  and assume that  $B_0 = 1$ .
- The cash-account is **not** risk-free since  $B_{t+s}$  is not known at time  $t$  for any  $s > 1$ 
  - it is **locally** risk-free since  $B_{t+1}$  is known at time  $t$ .
- Note that  $B_t$  satisfies  $B_t = (1 + r_{0,0})(1 + r_1) \dots (1 + r_{t-1})$ 
  - so that  $B_t/B_{t+1} = 1/(1 + r_t)$ .
- Risk-neutral pricing for a “non-coupon” paying security then takes the form:

$$\begin{aligned} Z_{t,j} &= \frac{1}{1 + r_{t,j}} [q_u \times Z_{t+1,j+1} + q_d \times Z_{t+1,j}] \\ &= \mathbb{E}_t^{\mathbb{Q}} \left[ \frac{Z_{t+1}}{1 + r_{t,j}} \right] \\ &= \mathbb{E}_t^{\mathbb{Q}} \left[ \frac{B_t}{B_{t+1}} Z_{t+1} \right] \end{aligned} \tag{4}$$

# Risk-Neutral Pricing with the Cash-Account

- Therefore for a non-coupon paying security, (4) is equivalent to

$$\frac{Z_t}{B_t} = \mathbb{E}_t^{\mathbb{Q}} \left[ \frac{Z_{t+1}}{B_{t+1}} \right] \quad (5)$$

- We can iterate (5) to obtain

$$\frac{Z_t}{B_t} = \mathbb{E}_t^{\mathbb{Q}} \left[ \frac{Z_{t+s}}{B_{t+s}} \right] \quad (6)$$

for any non-coupon paying security and any  $s > 0$ .

# Risk-Neutral Pricing with the Cash-Account

- **Risk-neutral** pricing for a “coupon” paying security takes the form:

$$\begin{aligned} Z_{t,j} &= \frac{1}{1 + r_{t,j}} [q_u (Z_{t+1,j+1} + C_{t+1,j+1}) + q_d (Z_{t+1,j} + C_{t+1,j})] \\ &= \mathbb{E}_t^{\mathbb{Q}} \left[ \frac{Z_{t+1} + C_{t+1}}{1 + r_{t,j}} \right] \end{aligned} \quad (7)$$

- We can rewrite (7) as

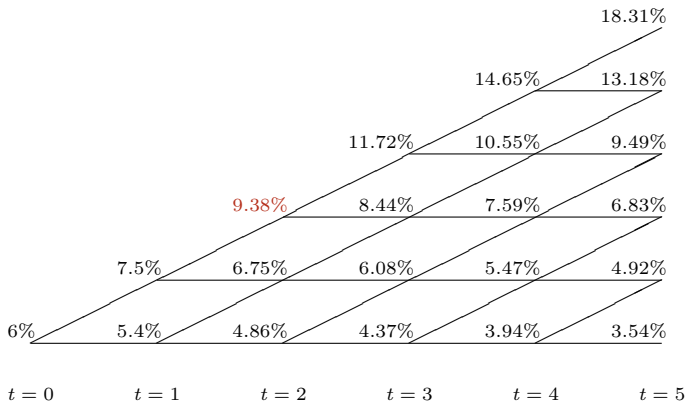
$$\frac{Z_t}{B_t} = \mathbb{E}_t^{\mathbb{Q}} \left[ \frac{C_{t+1}}{B_{t+1}} + \frac{Z_{t+1}}{B_{t+1}} \right] \quad (8)$$

- More generally, we can iterate (8) we obtain

$$\frac{Z_t}{B_t} = \mathbb{E}_t^{\mathbb{Q}} \left[ \sum_{j=t+1}^{t+s} \frac{C_j}{B_j} + \frac{Z_{t+s}}{B_{t+s}} \right] \quad (9)$$

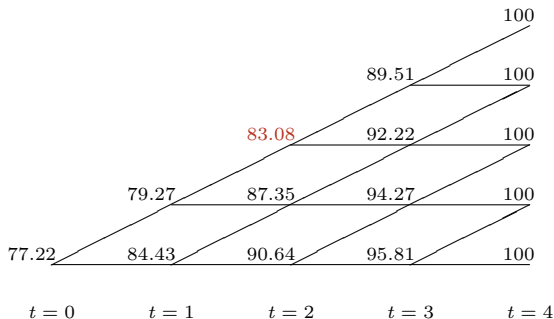
- Pricing using (9) ensures **no-arbitrage**
  - note that (6) is a special case of (9).

# A Sample Short-Rate lattice



The short-rate,  $r$ , grows by a factor of  $u = 1.25$  or  $d = .9$  in each period  
– not very realistic but more than sufficient for our purposes.

# Pricing a ZCB that Matures at Time $t=4$

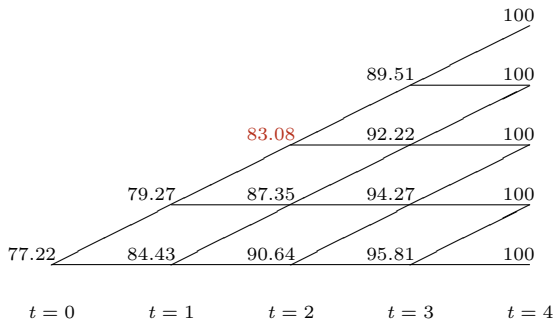


$$\text{e.g. } 83.08 = \frac{1}{1 + .0938} \left[ \frac{1}{2} \times 89.51 + \frac{1}{2} \times 92.22 \right].$$

Can compute the **term-structure** by pricing ZCB's of every maturity and then backing out the spot-rates for those maturities

- so  $s_4 = 6.68\%$  assuming per-period compounding, i.e.,  $77.22(1 + s_4)^4 = 100$ .

# Pricing a ZCB that Matures at Time $t=4$



Therefore can compute  $Z_0^1$ ,  $Z_0^2$ ,  $Z_0^3$  and  $Z_0^4$

- and then compute  $s_1$ ,  $s_2$ ,  $s_3$  and  $s_4$  to obtain the **term-structure of interest rates** at time  $t = 0$ .

At  $t = 1$  we will compute new ZCB prices and obtain a new term-structure

- model for the short-rate,  $r_t$ , therefore defines a model for the term-structure!

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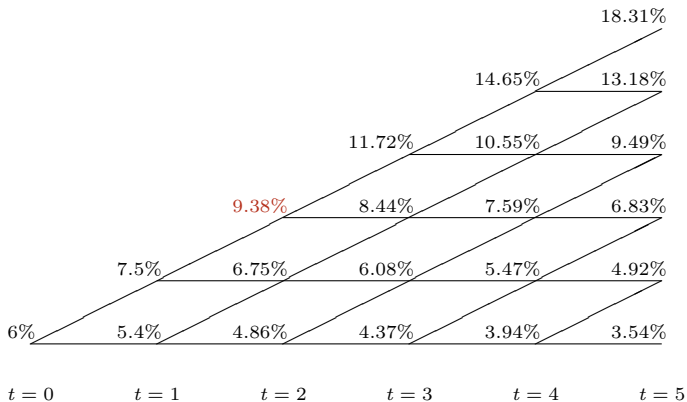
## Fixed Income Derivatives: Options on Bonds

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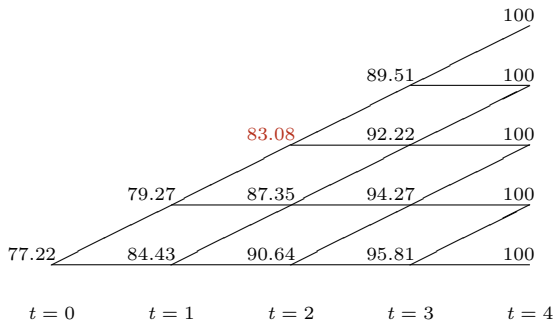
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# Our Sample Short-Rate lattice

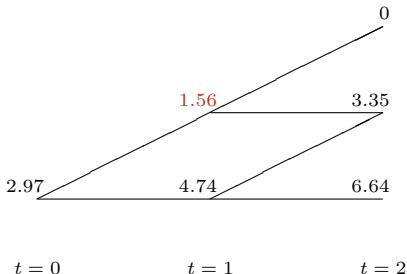


# Pricing a ZCB that Matures at Time $t=4$



e.g.  $83.08 = \frac{1}{1 + .0938} \left[ \frac{1}{2} \times 89.51 + \frac{1}{2} \times 92.22 \right]$ .

# Pricing a European Call Option on the ZCB



Strike = \$84

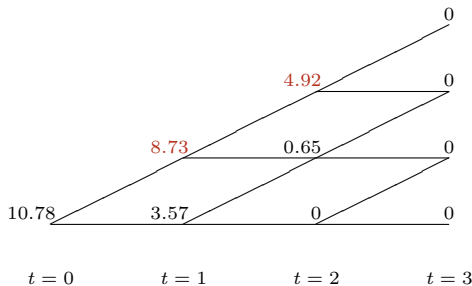
Option Expiration at  $t = 2$

Option Payoff =  $\max(0, Z_{2,.}^4 - 84)$

Underlying ZCB Matures at  $t = 4$

$$\text{e.g. } 1.56 = \frac{1}{1 + .075} \left[ \frac{1}{2} \times 0 + \frac{1}{2} \times 3.35 \right].$$

# Pricing an American Put Option on a ZCB



Strike = \$88

Expiration at  $t = 3$

Payoff at  $t = 3$  is  $\max(0, 88 - Z_{3,.}^4)$

Underlying ZCB Matures at  $t = 4$

$$\text{e.g. } 4.92 = \max \left\{ 88 - 83.08, \frac{1}{1 + .0938} \left[ \frac{1}{2} \times 0 + \frac{1}{2} \times 0 \right] \right\}.$$

$$\text{e.g. } 8.73 = \max \left\{ 88 - 79.27, \frac{1}{1 + .075} \left[ \frac{1}{2} \times 4.92 + \frac{1}{2} \times 0.65 \right] \right\}.$$

Turns out it's optimal **early-exercise** everywhere

– not a very realistic example.

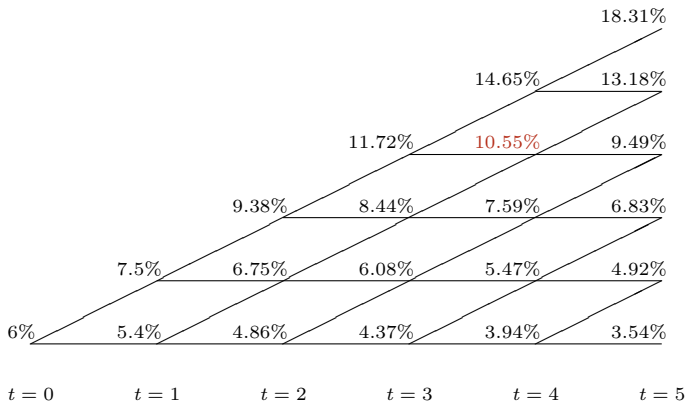
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## Fixed Income Derivatives: Bond Forwards

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# Our Sample Short-Rate lattice



# Pricing a Forward on a Coupon-Bearing Bond

- Delivery at  $t = 4$  of a 2-year 10% coupon-bearing bond.
- We assume delivery takes place just **after** a coupon has been paid.
- In the pricing lattice we use backwards induction to compute the  $t = 4$  ex-coupon price of the bond.
- Let  $G_0$  be the forward price at  $t = 0$  and let  $Z_4^6$  be the ex-coupon bond price at  $t = 4$ . Then risk-neutral pricing implies

$$0 = E_0^{\mathbb{Q}} \left[ \frac{Z_4^6 - G_0}{B_4} \right]$$

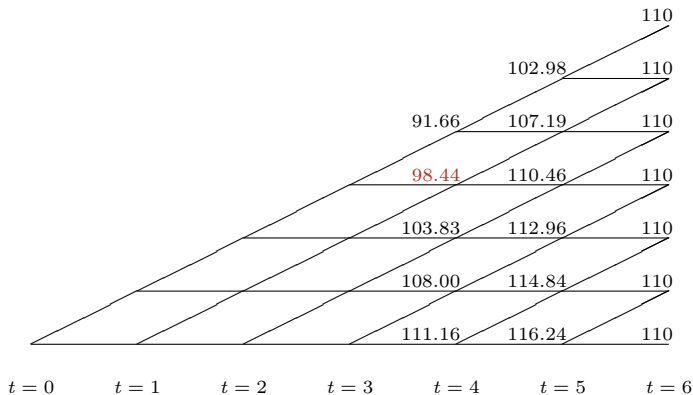
where  $B_4$  is the value of the **cash-account** at  $t = 4$ .

- Rearranging terms and using the fact that  $G_0$  is **known** at date  $t = 0$  we obtain

$$G_0 = \frac{E_0^{\mathbb{Q}} [Z_4^6 / B_4]}{E_0^{\mathbb{Q}} [1 / B_4]}. \quad (10)$$

- Recall that  $E_0^{\mathbb{Q}} [1 / B_4]$  is time  $t = 0$  price of a ZCB maturing at  $t = 4$  but with a face value \$1
  - have already calculated this to be **.7722**.

# Pricing a Forward on a Coupon-Bearing Bond

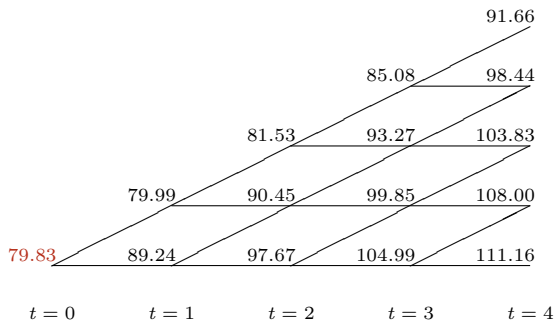


First find ex-coupon price,  $Z_4^6$ , of the bond at time  $t = 4$ :

$$\text{e.g. } 98.44 = \frac{1}{1 + .1055} \left[ \frac{1}{2} \times 107.19 + \frac{1}{2} \times 110.46 \right].$$



# Pricing a Forward on a Coupon-Bearing Bond



Now work backwards in lattice to compute  $E_0^Q [Z_4^6 / B_4] = 79.83$ .

Can now use (13) to obtain

$$G_0 = \frac{79.83}{0.7722} = 103.38.$$

# Financial Engineering & Risk Management

## Fixed Income Derivatives: Bond Futures

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# Pricing Futures Contracts

- Let  $F_k$  be the date  $k$  price of a futures contract that expires after  $n$  periods.
- Let  $S_k$  denote the time  $k$  price of the security underlying the futures contract.
- Then  $F_n = S_n$ , i.e., at expiration the futures price and the underlying security price must coincide.
- Can compute the futures price at  $t = n - 1$  by recalling that anytime we enter a futures contract, the initial value of the contract is 0.
- Therefore the futures price,  $F_{n-1}$ , at date  $t = n - 1$  must satisfy (why?)

$$\frac{0}{B_{n-1}} = \mathbb{E}_{n-1}^{\mathbb{Q}} \left[ \frac{F_n - F_{n-1}}{B_n} \right].$$

# Pricing Futures Contracts

- Since  $B_n$  and  $F_{n-1}$  are both known at date  $t = n - 1$ , we therefore have

$$F_{n-1} = E_{n-1}^{\mathbb{Q}}[F_n].$$

- By the same argument, we obtain

$$F_k = E_k^{\mathbb{Q}}[F_{k+1}] \quad \text{for } 0 \leq k < n.$$

- Can then use the law of iterated expectations to obtain

$$F_0 = E_0^{\mathbb{Q}}[F_n].$$

- Since  $F_n = S_n$  we have

$$F_0 = E_0^{\mathbb{Q}}[S_n] \tag{11}$$

– holds regardless of whether or not underlying security pays coupons etc.

- In contrast corresponding forward price,  $G_0$ , satisfies

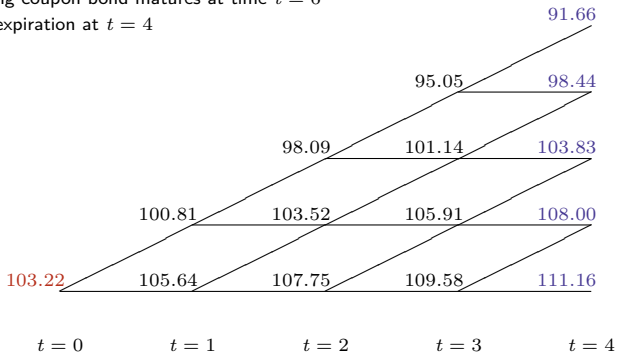
$$G_0 = \frac{E_0^{\mathbb{Q}}[S_n/B_n]}{E_0^{\mathbb{Q}}[1/B_n]}. \tag{12}$$

# A Futures Contract on a Coupon-Bearing Bond

Futures contract written on same coupon bond as earlier forward contract

Underlying coupon bond matures at time  $t = 6$

Futures expiration at  $t = 4$



Note that the forward price, 103.38, and futures price, 103.22, are close – but not equal!

# Financial Engineering & Risk Management

Fixed Income Derivatives: Caplets and Floorlets

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# Pricing a Caplet

A **caplet** is similar to a European call option on the interest rate,  $r_t$ .

- Usually settled **in arrears** but they may also be settled in advance.
- If maturity is  $\tau$  and strike is  $c$ , then payoff of a caplet (settled in arrears) at time  $\tau$  is

$$(r_{\tau-1} - c)^+$$

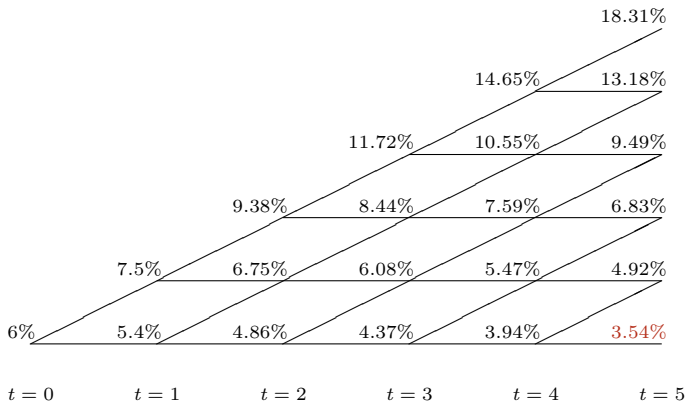
– so the caplet is a call option on the short rate prevailing at time  $\tau - 1$ , settled at time  $\tau$ .

A **floorlet** is the same as a caplet except the payoff is  $(c - r_{\tau-1})^+$ .

A **cap** consists of a sequence of caplets all of which have the same strike.

A **floor** consists of a sequence of floorlets all of which have the same strike.

# Our Short-Rate lattice

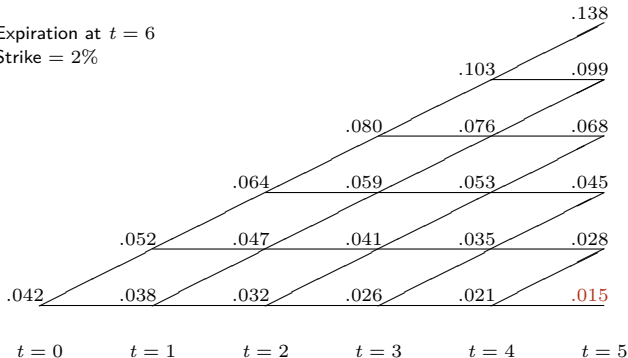




# Pricing a Caplet

Expiration at  $t = 6$

Strike = 2%



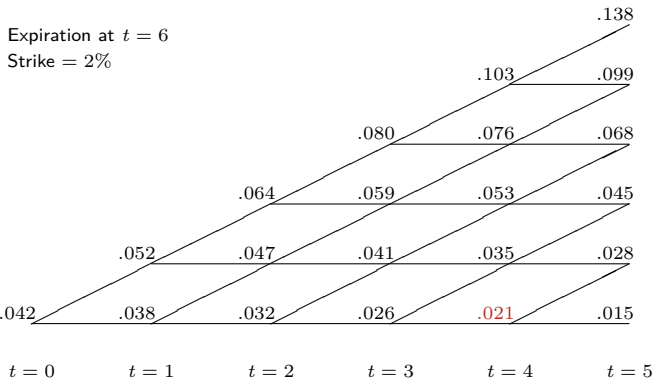
Note that it is easier to record the time  $t = 6$  cash flows at their time 5 predecessor nodes, and then discount them appropriately:

– so  $(r_5 - c)^+$  at  $t = 6$  is worth  $(r_5 - c)^+ / (1 + r_5)$  at  $t = 5$ .

A sample calculation:

$$0.015 = \frac{\max(0, .0354 - .02)}{1 + .0354}$$

# Pricing a Caplet



Now work backwards in the lattice to find the price at  $t = 0$ .

A sample calculation:

$$0.021 = \frac{1}{1.0394} \left[ \frac{1}{2} \times 0.028 + \frac{1}{2} \times 0.015 \right]$$

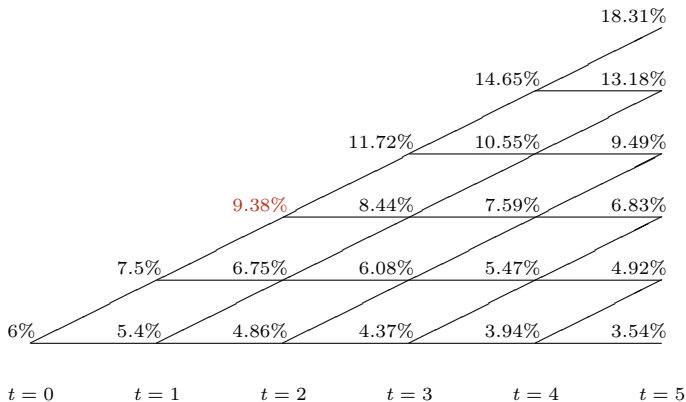
# Financial Engineering & Risk Management

Fixed Income Derivatives: Swaps and Swaptions

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# Our Short-Rate lattice



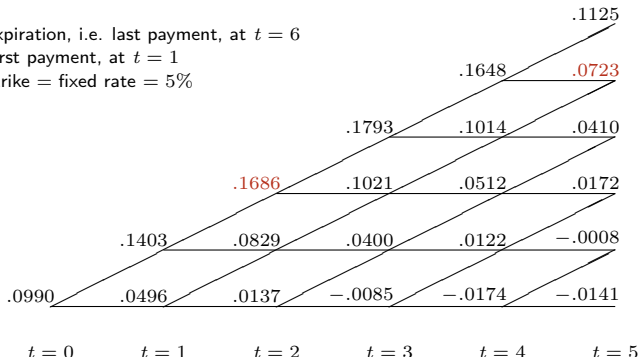
- Want to price an **interest-rate swap** with fixed rate of 5% that expires at  $t = 6$
- first payment at  $t = 1$  and final payment at  $t = 6$
  - payment of  $\pm(r_{i,j} - K)$  made at time  $t = i + 1$  if in state  $j$  at time  $i$ .

# Pricing Swaps

Expiration, i.e. last payment, at  $t = 6$

First payment, at  $t = 1$

Strike = fixed rate = 5%



Note that it is easier to record the time  $t$  cash flows at their time  $t - 1$  predecessor nodes, and then discount them appropriately:

– so  $(r_{5,5} - K)$  at  $t = 6$  is worth  $\pm(r_{5,5} - K)/(1 + r_{5,5}) = .0723$  at  $t = 5$ .

A sample calculation:

$$.1686 = \frac{1}{1.0938} \left[ (.0938 - .05) + \frac{1}{2} \times 0.1793 + \frac{1}{2} \times 0.1021 \right]$$

# Pricing Swaptions

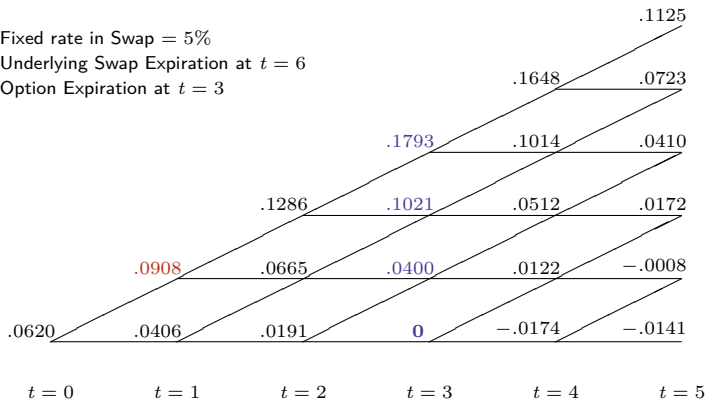
- A **swaption** is an option on a swap.
- Consider a swaption on the swap of the previous slide
  - will assume that the option strike is 0%
    - not to be confused with the strike, i.e. fixed rate, of underlying swap
  - and the swaption expiration is at  $t = 3$ .
- Swaption value at expiration is therefore  $\max(0, S_3)$  where  $S_3 \equiv$  underlying swap price at  $t = 3$ .
- Value at dates  $0 \leq t < 3$  computed in usual manner by working backwards in the lattice
  - but underlying cash-flows of swap are **not** included at those times.

# Pricing Swaptions

Fixed rate in Swap = 5%

Underlying Swap Expiration at  $t = 6$

Option Expiration at  $t = 3$



Swaption price is computed by determining payoff at maturity, i.e  $t = 3$  and then working backwards in the lattice.

A sample calculation:

$$.0908 = \frac{1}{1 + .075} \left[ \frac{1}{2} \times .1286 + \frac{1}{2} \times .0665 \right]$$

# Financial Engineering & Risk Management

The Forward Equations

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# The Forward Equations

- $P_{i,j}^e$  denotes the time 0 price of a security that pays \$1 at time  $i$ , state  $j$  and 0 at every other time and state.
- Call such a security an **elementary security** and  $P_{i,j}^e$  is its **state price**.
- Can see that elementary security prices satisfy the **forward equations**

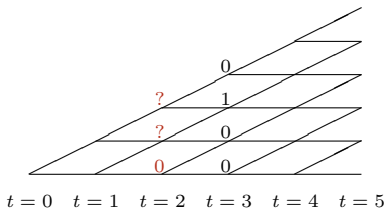
$$P_{k+1,s}^e = \frac{P_{k,s-1}^e}{2(1+r_{k,s-1})} + \frac{P_{k,s}^e}{2(1+r_{k,s})}, \quad 0 < s < k+1 \quad (13)$$

$$P_{k+1,0}^e = \frac{1}{2} \frac{P_{k,0}^e}{(1+r_{k,0})}$$

$$P_{k+1,k+1}^e = \frac{1}{2} \frac{P_{k,k}^e}{(1+r_{k,k})}.$$

with  $P_{0,0}^e = 1$ .

# Deriving the Forward Equations



Consider the security that pays \$1 only at  $t = 3$  and only in state 2

– value of this security is  $P_{3,2}^e$  by definition.

But can also work backwards in lattice to price it. Its value at node  $N_{2,2}$  is

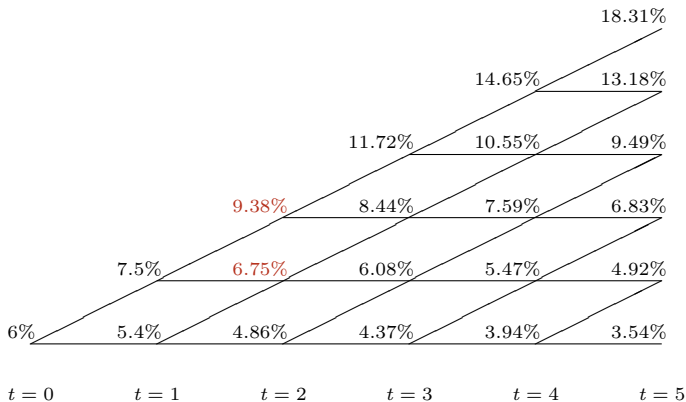
$$\frac{1}{1 + r_{2,2}} \left[ \frac{1}{2} \times 0 + \frac{1}{2} \times 1 \right] = \frac{1}{2(1 + r_{2,2})}$$

its value at node  $N_{2,0}$  is 0, and its value at node  $N_{2,1}$  is

$$\frac{1}{1 + r_{2,1}} \left[ \frac{1}{2} \times 1 + \frac{1}{2} \times 0 \right] = \frac{1}{2(1 + r_{2,1})}.$$

Therefore  $P_{3,2}^e = \frac{1}{2(1+r_{2,2})} \times P_{2,2}^e + \frac{1}{2(1+r_{2,1})} \times P_{2,1}^e + 0 \times P_{2,0}^e$ .

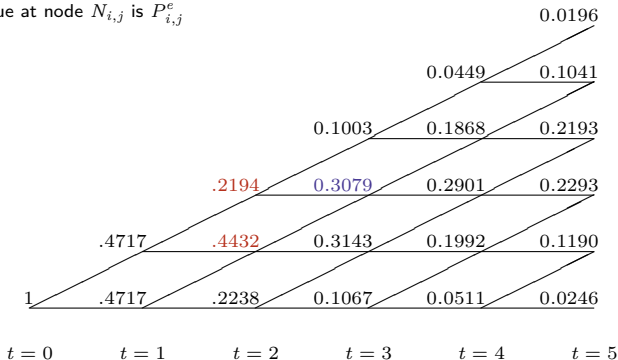
# Our Short-Rate lattice



Now compute the forward prices by iterating the equations **forward** starting with  $P_{0,0}^e = 1$ .

# ... and the Corresponding Elementary Prices

Key: Value at node  $N_{i,j}$  is  $P_{i,j}^e$



Sample calculations:

$$\begin{aligned}
 .3079 &= \frac{P_{k,s-1}^e}{2(1+r_{k,s-1})} + \frac{P_{k,s}^e}{2(1+r_{k,s})} \\
 &= \frac{.4432}{2(1+.0675)} + \frac{.2194}{2(1+.0938)}
 \end{aligned}$$

# Derivative Prices Via Elementary Prices

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Given the elementary prices the calculation of some security prices becomes very straightforward:

**e.g.** Can calculate  $Z_0^4$  as

$$\begin{aligned} Z_0^4 &= 100 \times (.0449 + .1868 + .2901 + .1992 + .0511) \\ &= 77.22 \end{aligned}$$

– as calculated before.

# Derivative Prices Via Elementary Prices

Consider a **forward-start** swap that begins at  $t = 1$  and ends at  $t = 3$

- notional principal is \$1 million
- fixed rate in the swap is 7%
- payments at  $t = i$  for  $i = 2, 3$  are based as usual on fixed rate minus floating rate that prevailed at  $t = i - 1$

The “forward” feature of the swap is that it begins at  $t = 1$

- first payment is then at  $t = 2$  since payments are made in arrears.

**Question:** What is the value,  $V_0$ , of the forward swap today at  $t = 0$ ?

**Solution:** The value is given by

$$\begin{aligned} V_0 &= \frac{(.07 - .0938)}{1.0938} \times .2194 + \frac{(.07 - .0675)}{1.0675} \times .4432 + \frac{(.07 - .0486)}{1.0486} \times .2238 \\ &\quad + \frac{(.07 - .075)}{1.075} \times .4717 + \frac{(.07 - .054)}{1.054} \times .4717 \\ &= \$5,800. \end{aligned}$$