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# Exotic interest-rate options

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## Lecture Summary

- Exotic caps, floors, and swaptions
- Swaps with exotic floating-rate legs
- No-arbitrage methods (commodity example)
- Numeraires and pricing formulas
- stochastic differential equations (SDEs)
- Partial differential equations (PDEs)
- Feynman-Kac formula
- Numerical methods: analytical approximations

## Common exotic interest-rate options

There are all sorts of exotic interest-rate options.

The least exotic, i.e. commonly traded, types are

- Caps and floors with a digital payoff
- Caps and floors with barriers
- Bermuda and American Swaptions

## Caps and floors with a digital payoff

A vanilla Cap has caplets with payoff

$$\text{Caplet}_V^{\text{Payoff}} = N T(6m, 9m) \max [(3m\text{-Libor} - K), 0] \quad (1)$$

A *digital* Cap has caplets with payoff

$$\text{Caplet}_D^{\text{Payoff}} = \begin{cases} N T(6m, 9m) R & \text{for } 3m\text{-Libor} \geq K \\ 0 & \text{for } 3m\text{-Libor} < K \end{cases} \quad (2)$$

# Exotic interest-rate options

**Euro CAP ( Semi-annual - MM Act/360 ) - Bullet** Caps & Floors Help

EUR Default VCAP IRGS/1 120 60 EU News Swaption Pricing 210ct11

Vanilla Digital Barrier

Type **CAP**  Bullet  Linear Amortisation  Schedule

Value Date **25 Oct11** Digital

Maturity Date **5y** Cap Payout **1.00%**

Frequency & Rate Type **Semi-annual** **MM Act/360**

CAP strike **2.013%**

**Contributed Volatility**  Apply Smile  Apply Fwd Vol

CAP Volatility **0.0000%**

Reset In Arrears

Curve Type **Reuters Zero Curve**  
Curve: EUR - Swap vs 6M

Premium & Implied Volatility			Sensitivity	
Notional	<b>Seller</b>	<b>1m</b>	Delta	<b>0.1246</b>
Cap Premium		<b>161.62 bp</b>	Gamma	
Implied Volatility		<b>18.64%</b>	Vega	
Premium in EUR		<b>16,162.12</b>	Theta	
Equiv per period (ann)		<b>37.27 bp</b>	BPV	<b>1.1482</b>
Current Caplet Value		<b>0.00</b>	Convexity	<b>-0.6882</b>
Strike by Premium Solver			Fwd Delta	<b>0.1327</b>
Premium		<b>100.00 bp</b>	Fwd Gamma	
CAP strike	Solve	<b>6.082%</b>		

**Premium & CF** **Underlying Instrument and Convention** **Volatilities**

Skip current Caplet

Strikes & Volatility used to calculate the Caplets/Floorlets						Premium			Sensitivity	
Start Date	Cap Strike	Floor Strike	Cap Volatility	Floor Volatility	Fwd Rate	Amount	Remaining	Repaid Amount	Delta	Convexity
25 Oct11	2.013%		0.00%		1.7210%					
25 Apr12	2.013%				1.4950%	0.00	1,000,000		0.0000	0.0000
25 Oct12	2.013%		85.46%		1.3858%	956.97	1,000,000		0.1166	-0.0041
25 Apr13	2.013%				1.5145%	0.00	1,000,000		0.0000	0.0000
25 Oct13	2.013%		100.09%		1.7367%	1010.14	1,000,000		0.0588	-0.0161
25 Apr14	2.013%		18.71%		1.9558%	1970.53	1,000,000		0.3431	-0.0563
27 Oct14	2.013%		17.42%		2.2178%	2697.46	1,000,000		0.2962	-0.2093
27 Apr15	2.013%		21.54%		2.4435%	2863.71	1,000,000		0.1966	-0.1344
26 Oct15	2.013%		19.23%		2.6671%	3266.82	1,000,000		0.1699	-0.1446
25 Apr16	2.013%		19.05%		2.8308%	3396.48	1,000,000		0.1443	-0.1233

## Caps and floors with barriers

A barrier Cap has caplets with payoff

$$\text{Caplet}_V^{\text{Payoff}} = N T(6m, 9m) \max [(3m\text{-Libor} - K), 0] \quad (3)$$

- Knock-in: paid if 3m-Libor **touches** a barrier  $r_{\text{knock-in}}$
- Knock-out: paid if 3m-Libor **does not** reach  $r_{\text{knock-out}}$

**Discrete** barriers are checked at certain given barrier dates

**Continuous** barriers are checked on each daily Libor fixing

Digital payoffs are also available. A *rebate* is paid upon knock out.

# Exotic interest-rate options

**Euro CAP ( Semi-annual - MM Act/360 ) - Bullet** Caps & Floors Help

EUR Default VCAP IRGS/1 EU News Swaption Pricing 21Oct11

Vanilla  Digital  Barrier  
 Type: **CAP**  Bullet  Linear Amortisation  Schedule

Value Date	25 Oct11	Barrier	Knock Out	Notional	Seller	1m
Maturity Date	5y	Upper Rebate	1.00%	Cap Premium		194.55 bp
Frequency & Rate Type	Semi-annual MM Act/360	Lower Rebate	0.20%	Implied Volatility		No solution found
CAP strike	2.013%	Upper Barrier	4.5000%	Premium in EUR		19,454.61
Contributed Volatility	Apply Smile <input type="checkbox"/> Apply Fwd Vol <input checked="" type="checkbox"/>	Lower Barrier	2.0000%	Equiv per period (ann)		44.88 bp
CAP Volatility	0.0000%			Current Caplet Value		1007.77
Reset In Arrears	<input type="checkbox"/>			Strike by Premium Solver		
Curve Type	Reuters Zero Curve			Premium		100.00 bp
	Curve: EUR - Swap vs 6M			CAP strike	Solve	6.082%

Skip current Caplet

Strikes & Volatility used to calculate the Caplets/Floorlets						Premium			Sensitivity	
Start Date	Cap Strike	Floor Strike	Cap Volatility	Floor Volatility	Fwd Rate	Amount	Remaining	Repaid Amount	Delta	Convexity
25 Oct11	2.013%		0.00%		1.7210%					
25 Apr12	2.013%				1.4950%	1000.16	1,000,000		0.0000	0.0000
25 Oct12	2.013%		85.46%		1.3858%	1624.82	1,000,000		0.1700	0.0162
25 Apr13	2.013%				1.5145%	985.62	1,000,000		0.0000	0.0001
25 Oct13	2.013%		100.09%		1.7367%	1750.40	1,000,000		0.0767	-0.0115
25 Apr14	2.013%		18.71%		1.9558%	1569.81	1,000,000		0.4304	0.2787
27 Oct14	2.013%		17.42%		2.2178%	2102.31	1,000,000		0.5548	0.1747
27 Apr15	2.013%		21.54%		2.4435%	2755.03	1,000,000		0.4337	-0.0097
26 Oct15	2.013%		19.23%		2.6671%	3193.94	1,000,000		0.4350	-0.0551
25 Apr16	2.013%		19.05%		2.8308%	3464.75	1,000,000		0.3729	-0.0803

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## Bermuda and American Swaptions

Very similar to standard Swaptions (known as European swaptions) can be exercised at other dates

- Bermuda swaptions: exercised dates are discrete (typically with the same tenor as one of the legs)
- American Swaption can be exercised at any time

Both are found in two different types of payoffs: *co-terminal swap* and *constant-maturity swap*



Questions?

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## More exotic interest-rate options

- Caps and floors on Constant-Maturity-Swaps rates (CMS)
- Look-back options
- TARN (Target Accumulator Redemption Note) swap legs
- Spread options

Usually these options are *gift-wrapped* within a swaps paying a fixed or a Libor rate

## Exotic swap legs

- Constant-maturity swaps (CMS)
- Spread options
- Ratchet swap
- Range accruals
- Look-back options
- TARN (Target Accumulator Redemption Note) swap legs

## Constant-maturity swaps (CMS)

A swap with a standard fixed-rate leg and a floating-rate leg that pays at times  $T_i$ , with  $i = 1, \dots, n$  cash flows given by

$$C_i = N \tau_{i-1} \text{CMS}_M(T_{i-1}) \quad (4)$$

where

- $\tau_i$  is the year fraction between dates  $T_i$  and  $T_{i+1}$
- $\text{CMS}_M(T_i)$  is the fair rate, observed at time  $T_i$ , of a vanilla swap (fixed leg against Libor leg) with maturity date  $T_i + M$

Constant-maturity swaps usually have Caps or Floors on the swap rate

## Swaps with spread options

A swap with a standard fixed-rate leg and a floating-rate leg that pays a cash flow given by the difference of two swap rates.

For example the floating leg fixing at time  $T_{i-1}$ , and paying at time  $T_i$ , payments are given by

$$C_i = N \tau_{i-1} \max [r_{\text{floor}}, \text{CMS}_{10Y}(T_{i-1}) - \text{CMS}_{2Y}(T_{i-1})]$$

- We are betting on the swap curve to steepen
- Usually a multi-factor model is needed to price this instrument

## Swap with ratchet options

Also known as *cliquet* option.

A swap with a standard fixed-rate leg and a floating-rate leg that pays at times  $T_2, \dots, T_n$  Caplet-like coupons,

$$C_i = N \tau_{i-1} \max(0, L_{i-1} - K_{i-1}) \quad (5)$$

where  $L_i$  is the Libor rate observed at time  $T_i$ , and  $K_i$  is the strike satisfying

$$K_{i-1} = \max(K_{i-2}, L_{i-2}) \quad \text{for } i = 3, \dots \quad (6)$$

Note: coupon rates are not decreasing. Usually  $K_1 = Fwd_{12}$

## Swaps with range accruals

A swap with a floating-rate leg paying coupons

$$C_i = N \tau_{i-1} \langle r \rangle \quad (7)$$

where the *average rate*  $\langle r \rangle$  is given by

$$\langle r \rangle = \frac{1}{K} \sum_{k \in [T_{i-1}, T_i)} f[L(t_k)] \quad (8)$$

$K$  business dates between  $T_{i-1}$  and  $T_i$ ,  
 $f$  being the *range* function of Libor rate

$$f(L) = \begin{cases} r_{\text{in}} & \text{for } L_{\text{min}} \leq L \leq L_{\text{max}} \\ r_{\text{out}} & \text{otherwise} \end{cases} \quad (9)$$

$L_{\text{min}}$  minimum Libor rate and  $L_{\text{max}}$  maximum Libor rate

## Look-back options

A swap with a floating-rate leg paying coupons on the maximum Libor fixing over a certain past period

$$C_i = N \tau_{i-1} r_{\max}(T_{i-1}, T_i) \quad (10)$$

where

$$r_{\max} = \max_{k \in [T_{i-2}, T_{i-1})} [L(t_k)] \quad (11)$$

- We always receive the best Libor fixing in a range
- Sometimes look-back periods extend further back than one coupon



## TARN (Target Accumulator Redemption Note) swap legs

A swap with a floating-rate leg paying coupons up to a maximum accumulated rate  $r_{\max}$

$$C_i = N \tau_{i-1} c_i \quad (12)$$

where

$$c_1 = \min [r_{\max}, L_0]$$

$$c_2 = \min [r_{\max} - c_1, L_1]$$

$$c_3 = \min [r_{\max} - c_1 - c_2, L_2]$$

...

Coupon rates are subtracted to the maximum rate until a zero rate is reached

Questions?

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## Crash course on commodity contracts

(Example of no-arbitrage methods)

- Introduction to commodities
- The forward-spot and the forward-forward relationship
- Convenience yields
- Example of commodity derivatives: The forward contract and the futures spread

## Exposure to commodity prices

If you are managing an hedge fund and want some exposure on the price of live cattle what can you do?

- A. Become a cowboy overnight and buy some live cattle
  
- B. Enter in a derivative contract that gives you an exposure to the live-cattle price (e.g. a futures contract)

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## Commodity futures contracts

- Commodity futures are among the oldest financial instrument traded on any trading floor
- Futures on the cotton price, for example, have traded on the market for longer than a century
- Refer to specialized literature for more details
- In this talk we describe how to generate simulated spot prices and convenience-yield curves (to be used in the computation of risk figures)

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## Copper, Corn, and WTI Oil

We consider three samples commodities

- Copper (a.k.a Dr. Copper): non-ferrous industrial metal quoted, in \$ per ton, on the London Metal Exchange (LME)
- Corn: an agriculture commodity quoted, in \$-cents per bushel (27,216 kg), on the Chicago Board of Trade (CBoT)
- West-Texas-Intermediate Oil: an energy commodity quoted, in \$ per barrel (158.987 liters), on the New York Mercantile Exchange (NYMEX)

## Commodity futures contracts

A contract that allows the delivery of a commodity at a certain future date (however settled daily according to the close price).

E.g. on 2011-11-01 we observed the following market quotes

<b>Commodity</b>	<b>Maturity</b>	<b>Date</b>	<b>Price</b>
copper	2012G	2012-02-24	7993.00
copper	2012H	2012-03-27	7995.00
copper	2012J	2012-04-25	7995.50

## Commodity forward contracts

A **commodity forward contract** is struck between two parties that agree to buy/sell a given commodity at a future date at a pre-determined price (the strike price).

Settlement could be physical or cash. In case of cash settlement the payoff  $P$  at the maturity date  $T$  (for the long side) is given by the difference between the value of the underlying commodity spot price  $S(T)$  and a strike price  $K$ .

For  $W$  lots we have,

$$P = W \cdot [S(T) - K] \quad (13)$$



## Arbitrage-free strategies

An arbitrage-free strategy is ...

**A series of physical or financial transactions that starting with a portfolio with a zero value end up with a risk-less portfolio.**

The no-arbitrage assumption states that the final portfolio value is zero with 100% probability (otherwise we could buy the cheaper part and sell the dearer one making a risk-free profit with some probability).

## Spot-forward relationship (1/2)

For a *storable commodity*. Consider a forward contract on a certain storable commodity (no costs no benefits) asset and set up the following strategy:

Today borrow an amount  $S$  of currency, exactly enough to buy the spot asset (since  $T$  is a short maturity the borrowing can be made at reasonable, i.e. risk-free like, interest rates) and enter into a short forward contract to sell the asset at a future date  $T$  at a price  $f$ ; then store the asset until the date  $T$ ; when the date  $T$  comes, enforce the contract and sell the asset for a price  $f_T$ , finally, payback the loan with interests.

## Spot-forward relationship (2/2)

The strategy can be summarized in the following table

Date	Description	Cash flows	Asset exch.
$t = 0$	borrow an amount $S$ of cash	$+S$	
	purchase the asset at spot price	$-S$	+ asset
	enter into a short forward at $T$	0	
$0 < t < T$	store the asset		
$t = T$	use the asset to service the forward	$f_T$	- asset
	repay debt with interests	$-S[1 + R(T)T]$	

Because of no arbitrage we have

$$f_T = S[1 + R(T)T] \quad (14)$$

## Adding costs and benefits

In the case of a commodity, for a dividend-paying stock, for a bond, and for some other asset types, in general there are costs and/or benefits associated in holding the asset,

$$f_T = S[1 + R(T)T] + \text{Cos}(T) - \text{Ben}(T) \quad (15)$$

Assuming costs and benefits to be proportional to the asset price, using simple compounding,

$$f_T = S[1 + RT] + S[Y_{\text{Cos}}T - Y_{\text{Ben}}T] \quad (16)$$

## Convenience yield

We can define the convenience yield as the difference between benefits and costs,

$$y = Y_{\text{Ben}} - Y_{\text{Cos}} \quad (17)$$

so that

$$f_T = S[1 + RT - YT] = S \frac{e^{-yT}}{e^{-rT}} \quad (18)$$

where we used continuous compounding. Using the discount factor we have,

$$f_T = \frac{S}{D(T)} e^{-yT} \quad (19)$$

Note: the **convenience yield**  $y$  usually depends on the maturity  $T$ .

## Forward-forward relationship

Strategy: at time  $t = 0$  enter into a long forward contract to buy the asset at  $T_1$  for  $f_1$  units of currency, at the same time enter into a short contract to sell the asset at date  $T_2$  for a price  $f_2$ ; at date  $t = T_1$  use the long forward contract to buy the asset for a price of  $f_1$  financing the purchase by borrowing the money from the market; at a later date  $T_2$  sell the commodity for  $f_2$

From arbitrage-free assumption we have

$$f_2 = f_1 \frac{D(T_1)}{D(T_2)} e^{-y_{12}(T_2 - T_1)} \quad (20)$$

where  $y_{12}$  is the **forward convenience yield** between  $T_1$  and  $T_2$ .

## General spot-forward relationship

The forward-forward relationship between  $T_2$  and  $T_3$  is

$$f_3 = f_2 \frac{D(T_2)}{D(T_3)} e^{-y_{23}(T_3 - T_2)} \quad (21)$$

Chain linking the spot-forward formula and multiple forward-forward relationships we can write

$$f_j = \frac{S}{D(T_j)} e^{-y_j T_j} \quad (22)$$

where

$$y_j T_j = y_1 T_1 + y_{12} (T_2 - T_1) + y_{23} (T_3 - T_2) + \dots + y_{ij} (T_j - T_i)$$

## Forward-futures relationship

The main difference between a futures contract and a forward contract is that the former must be settled daily while the latter is settled at the contract maturity. It can be shown that we have,

$$F^T = f^T + D(T) \sigma_S \sigma_r \rho_{r-S} \quad (23)$$

- $\sigma_S$  is the asset-price volatility
- $\sigma_r$  is the interest-rate volatility
- $\rho_{S-r}$  is the correlation between the asset price and the money-market account.



## Convenience yields from futures quotes

We assume  $|\sigma_S \sigma_r \rho_{r-S}| \ll 1$  so that

$$F^T \simeq f^T \quad (24)$$

Consider  $n$  futures contracts with maturities  $T_1, T_2, \dots, T_n$ , having, respectively, quotes  $F_1, F_2, \dots, F_n$  at some reference date.

From equation (22) and (24) we have

$$F_i = \frac{S}{D(T_i)} e^{-y_i T_i}, \quad \text{for } i = 1, \dots, n \quad (25)$$

compute the convenience yields  $y_i$ 's as

$$y_i = \frac{1}{T_i} \log \left( \frac{S}{D(T_i) F_i} \right) \quad (26)$$

## Yield on a commodity (1/2)

What is exactly the meaning of the convenience yield? Recall that

$$f_T = S \frac{1 + rT}{1 + yT} \quad (27)$$

and suppose we owe a commodity that is worth  $S$  today. Assume no credit risk and follow the strategy:

- Today sell the commodity; invest the money in risk-free deposit; enter in a forward contract to buy  $W = 1 + yT$  lots at  $T$
- At  $T$  recover the money and interests from the depo, and use the money to purchase the commodity at the forward-contract price

## Yield on a commodity (2/2)

In summary, starting with 1 lot of the asset

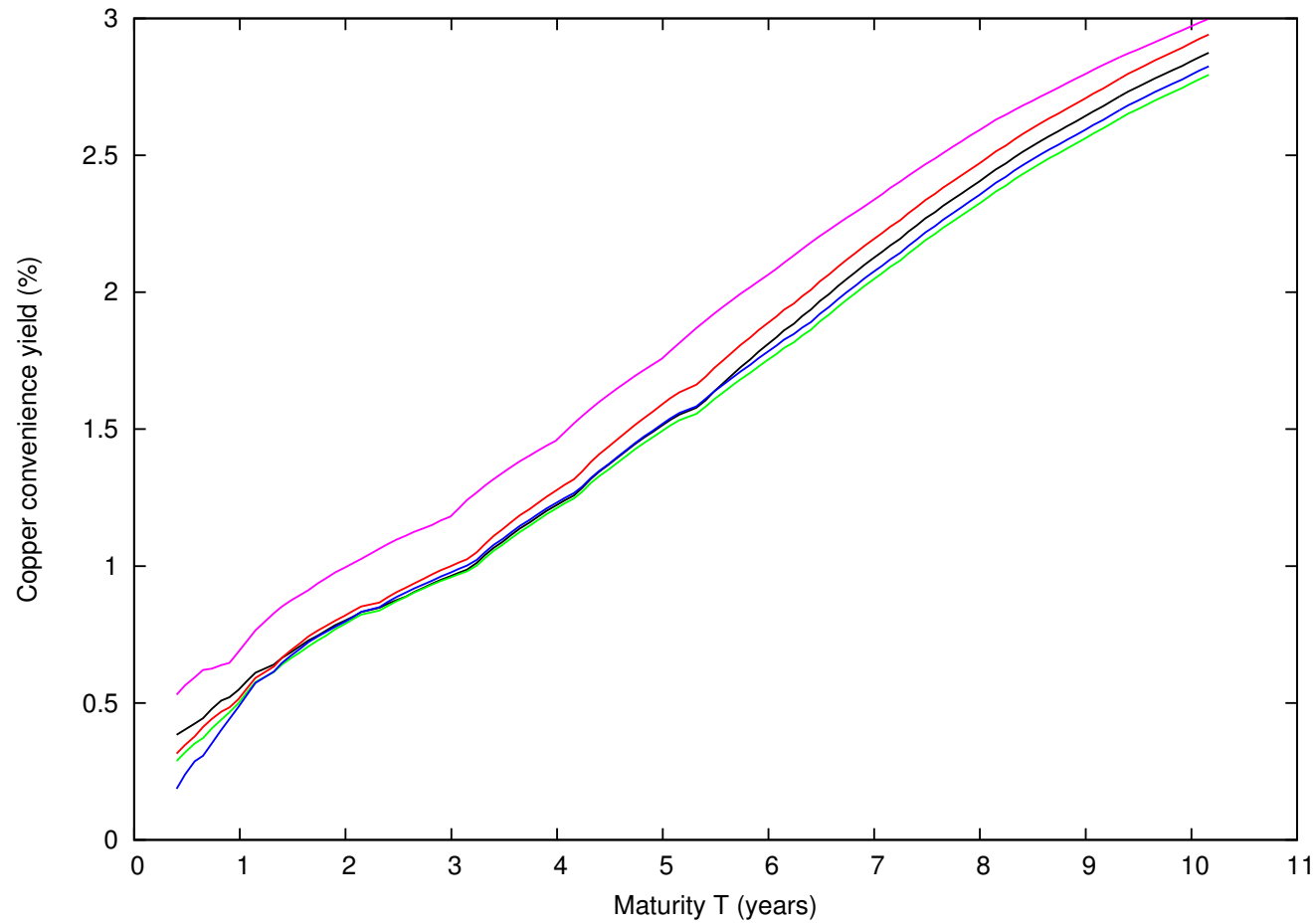
Date	Description	Cash flows	Asset exch.
$t = 0$	sell the asset at spot price $S$ invest the money in a deposit enter into $W$ long fwd contracts	$+S$ $-S$ $0$	$-1 \cdot \text{asset}$
$0 < t < T$	do nothing		
$t = T$	redeem the deposit use money to service the contract	$+S[1 + rT]$ $-S[1 + rT]$	$+W \cdot \text{asset}$

with  $W = 1 + yT$ . The contract payoff at redemption is given by

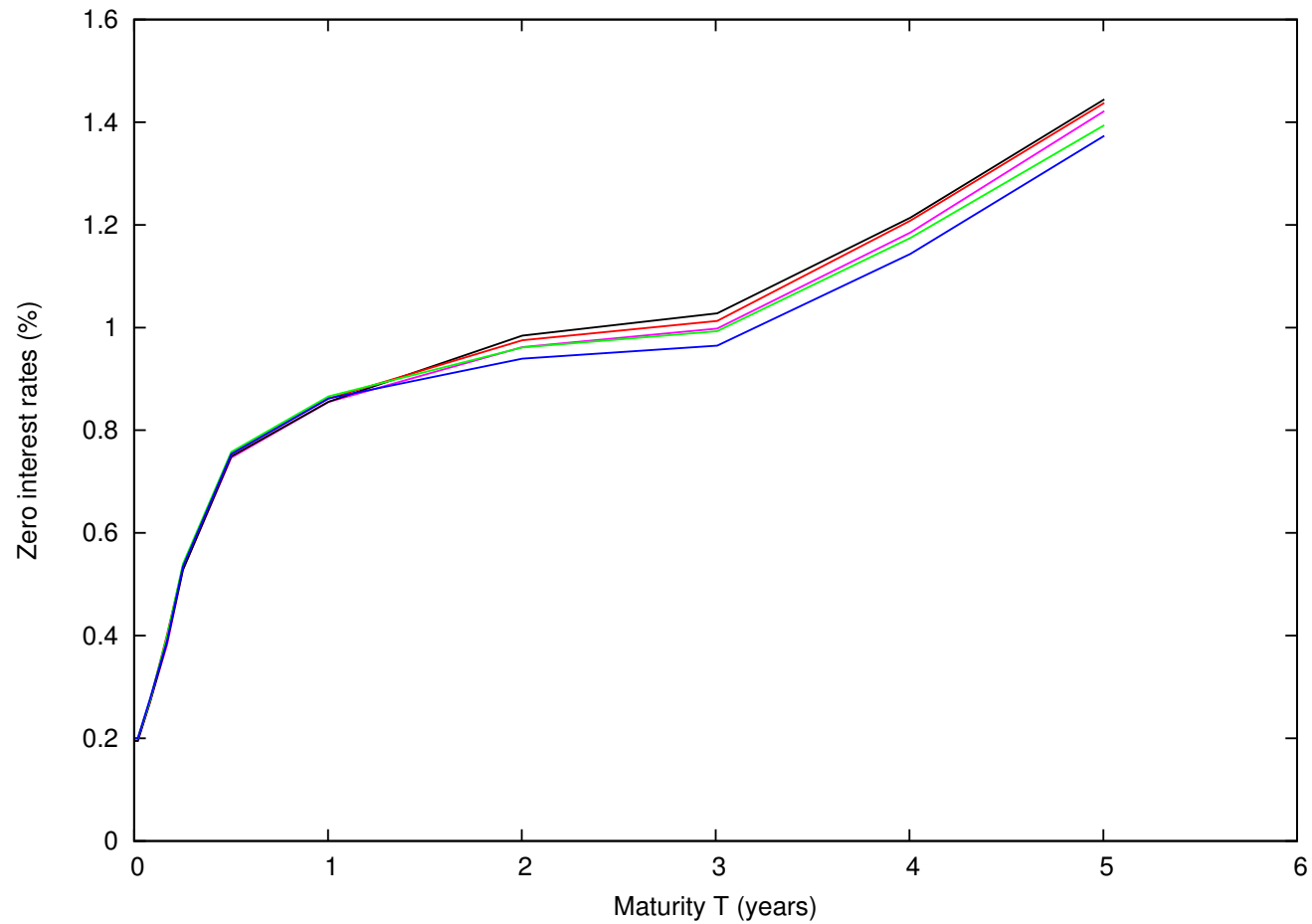
$$W \cdot f_T = (1 + yT) \cdot \left( S \frac{1 + rT}{1 + yT} \right) = S (1 + rT)$$

The commodity provided an interest  $yT$ !

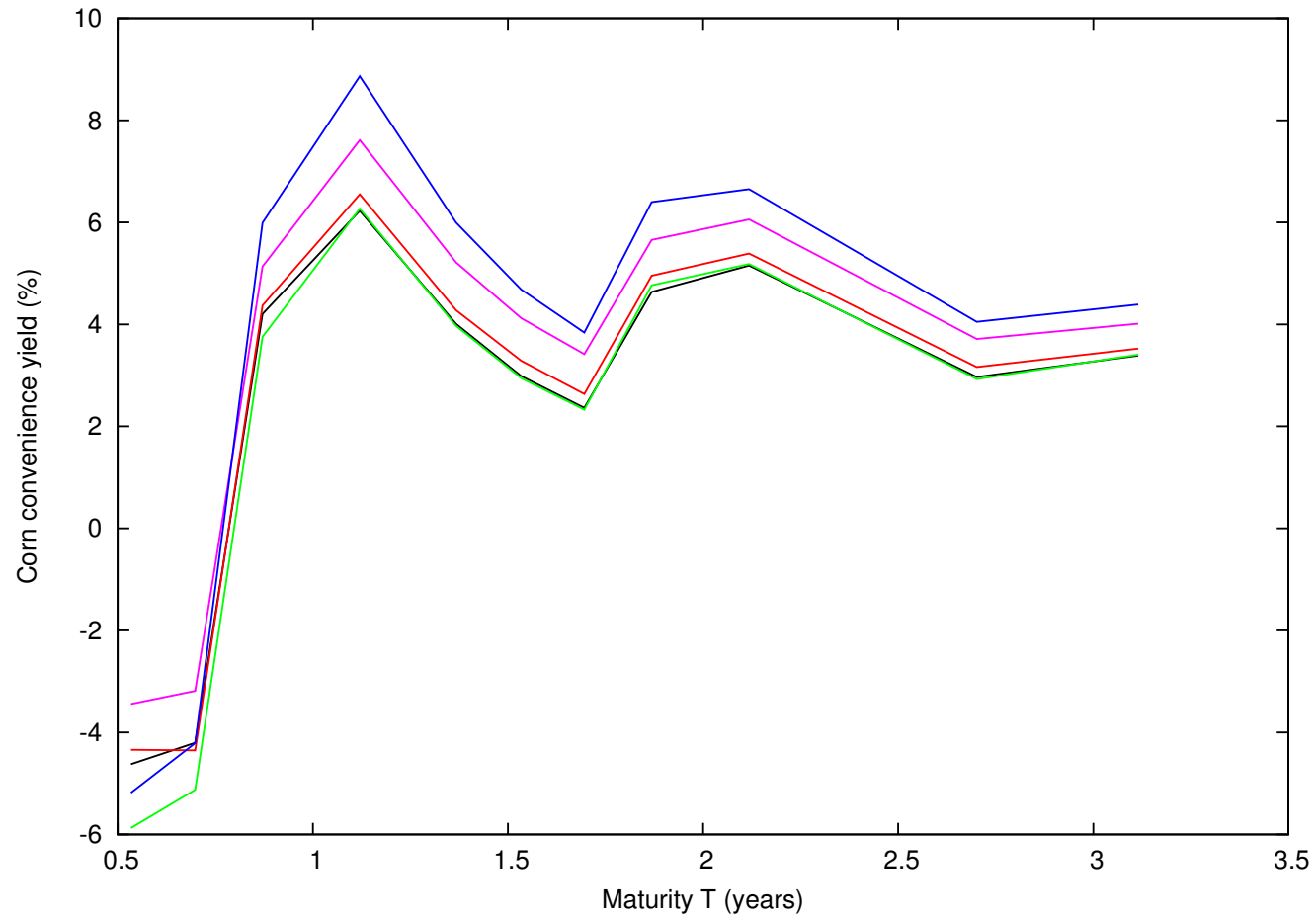
## Few convenience-yield curves for Copper



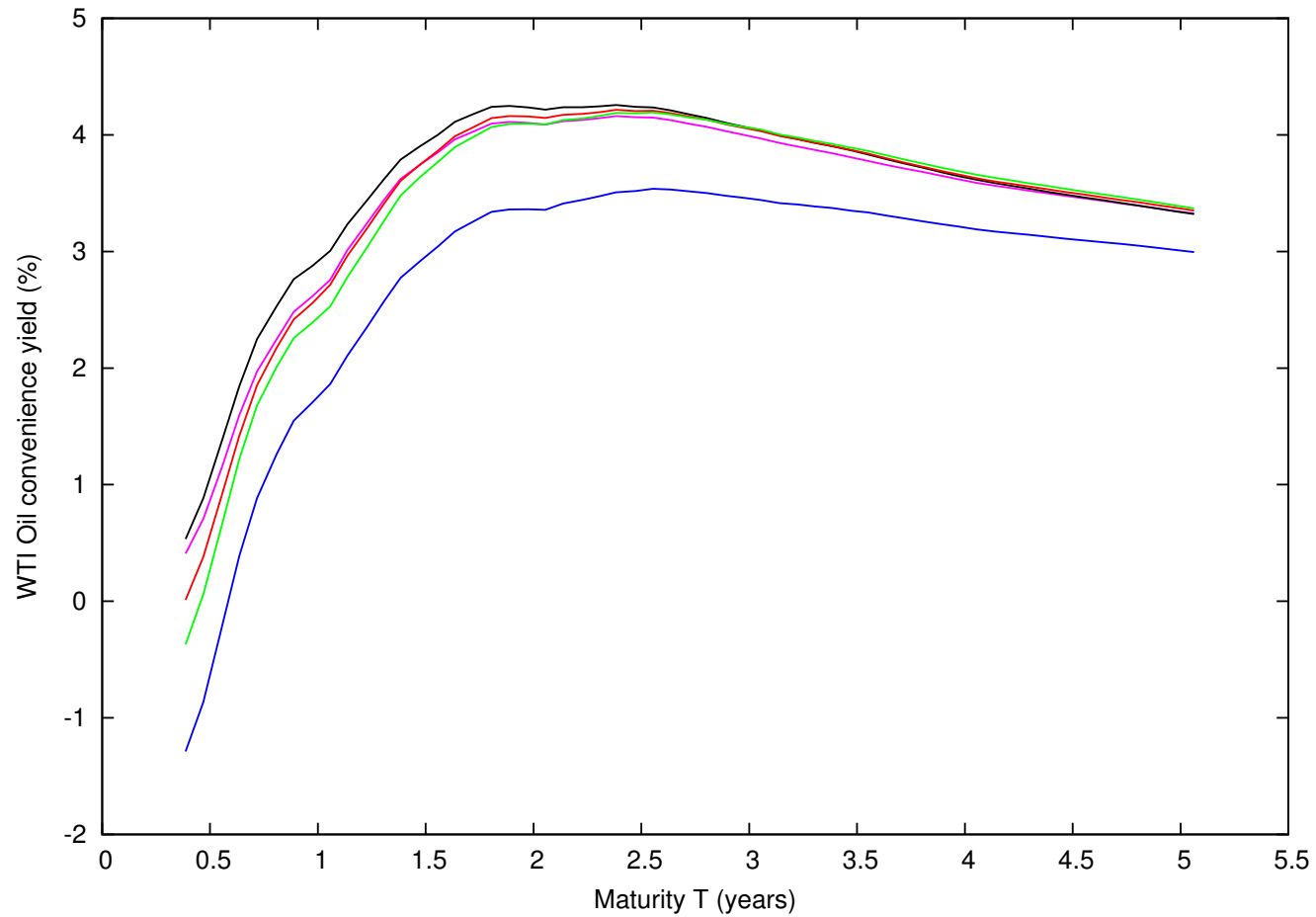
## Recall the zero interest-rate curves



Few convenience-yield curves for Corn



## Few convenience-yield curves for WTI Oil



## NPV of a commodity forward contract

Given the convenience yield curve  $y(T)$  define the (continuously-compounded) **convenience discount factor**  $D^c(T)$  as

$$D^c(T) = e^{-y(T)T} \quad (28)$$

so that the **commodity forward price** can be written as

$$f(T) = S \frac{D^c(T)}{D^r(T)}. \quad (29)$$

The commodity forward contract NPV is then given by

$$\text{NPV} = W \cdot D^s(T) \cdot [f(T) - K] \quad (30)$$

At inception  $\text{NPV}=0$  implies  $K = f(T)$ .



## Commodities as currencies

Recall that given two currencies € and \$ and their exchange rate  $X_{\text{€\$}}$

$$1 \$ = \frac{1\text{€}}{X_{\text{€\$}}}$$

we have the arbitrage-free forward exchange rate

$$X_{\text{€\$}}(T) = X_{\text{€\$}} \frac{D^{\$}(T)}{D^{\text{€}}(T)}$$

To be compared with the commodity relationship

$$f(T) = S \frac{D^c(T)}{D^r(T)}$$

Questions?

## Generic pricing formula (1/2)

Remember the discount factor relationship with the money account?

$$D(T) = E \left[ e^{-\int_0^T r(t) dt} \right] = E \left[ e^{-r_1 \tau_1 - \dots - r_n \tau_n} \right] \quad (31)$$

If one payment  $C$  is made at a future date  $T$  we have,

$$PV = D(T) C = E \left[ e^{-\int_0^T r(t) dt} C \right] \quad (32)$$

Assume now  $n$  deterministic cash flows  $C_1, C_2, \dots, C_n$ , one each day, i.e. at dates  $T_1, T_2, \dots, T_n$

$$PV = D(T_1) C_1 + D(T_2) C_2 + D(T_3) C_3 + \dots \quad (33)$$

## Generic pricing formula (2/2)

For example, in the simple case with only three dates we have

$$\begin{aligned}
 PV &= E \left[ e^{-r_1 \tau_1} C_1 + e^{-r_1 \tau_1 - r_2 \tau_2} C_2 + e^{-r_1 \tau_1 - r_2 \tau_2 - r_3 \tau_3} C_3 \right] \\
 &= e^{-r_1 \tau_1} \left\{ C_1 + E \left[ e^{-r_2 \tau_2} \left( C_2 + e^{-r_3 \tau_3} C_3 \right) \right] \right\} \\
 &= e^{-r_1 \tau_1} \left\{ C_1 + \sum_{r_2} P(r_2) \left[ e^{-r_2 \tau_2} E \left( C_2 + e^{-r_3 \tau_3} C_3 | r_2 \right) \right] \right\} \\
 &= e^{-r_1 \tau_1} \left\{ C_1 + \sum_{r_2} P(r_2) \left[ e^{-r_2 \tau_2} \left( C_2 + \sum_{r_3} P(r_3 | r_2) e^{-r_3 \tau_3} C_3 \right) \right] \right\}
 \end{aligned}$$

Wouldn't it be great if we could do the same for random cash flows?

## Pricing in absence of arbitrage

There is a fundamental result from Harrison and Kreps (1979) that holds for stochastic cash flows

**Theorem:** in absence of arbitrage, the generic pricing formula for an option with a payoff  $H(T, r_t)$ , depending on the interest rates  $r_t$ , is

$$PV = E \left[ e^{-\int_0^T r_t dt} H(T, r_t) \right] \quad (34)$$

where  $E$  is the *expected-value operator* on the risk-neutral measure.

In terms of the money-market account  $M(t)$ , recall  $M(0)$ , we have

$$PV = M(0) E \left[ \frac{H(T, r_t)}{M(T)} \right] \quad (35)$$

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## Numeraires

It turns out that formula (35) is a special case of a general theorem that holds for generic numeraire assets.

A *numeraire* is any tradable asset that

- is always positive
- does not pay any dividends (nor coupons)

Examples: risk-less money-market account, risk-less zero-coupon bond, the price of a commodity (e.g. the gold price). See Hull book for more examples.

## Equivalent Martingale Measure

### Theorem:

A continuous economy is arbitrage-free and every security is attainable if for every choice of numeraire there exists a unique equivalent (martingale) measure. The security PV is then given by

$$PV = N(0) E^N \left[ \frac{H(T, r_t)}{N(T)} \right] \quad (36)$$

- A security is attainable if it can be replicated (recall stock options replication with delta-hedging)
- The expectation  $E^N$  is taken according to the equivalent measure

## Change of Numeraire

How do we compute the expectation in (36)? E.g. using the following theorem.

Given two numeraires  $M$  and  $N$  and a financial quantity  $G$ ,

$$E^M [G] = E^N \left[ G \frac{M(T) N(0)}{M(0) N(T)} \right] \quad (37)$$

- This result was first proved by Geman et al. in 1995
- It is incredibly useful in practice



## Numeraire applications: payoff at maturity (1/2)

Consider the numeraire associated to a payoff of 1\$ at time  $T$  ( $N(0) = D(T)$ ,  $N(T) = 1$ ) and  $E^T$  the corresponding expectation, defining  $G$  as

$$G(T) = \frac{M(0)}{M(T)} H(T) \quad (38)$$

the forward payoff corresponding to  $H$ , then

$$PV = E^M [G(T)] = E^T \left[ G(T) \frac{M(T) N(0)}{M(0) N(T)} \right] \quad (39)$$

so that ...

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## Numeraire applications: payoff at maturity (2/2)

.. we obtain

$$PV = D(T) E^T [H(T)] \quad (40)$$

Notice how the stochastic rates disappeared.

Other examples (see Hull's book)

- Choosing  $N$  as the period-compounded deposit yields the correct measure for caplets and floorlets
- Choosing the fixed-rate annuity  $A_{fixed}$  as numeraire provides the measure used to price swaptions

Questions?

## Recall the Brownian motion

A continuous stochastic process  $W_t$  satisfying,

- $W_0 = 0$
- $W_t - W_s$  is independent from  $W_s$  (for  $0 < s < t$ )
- $W_t - W_s$  is normally distributed, precisely as  $N(0, t - s)$

is a standard Brownian motion.

Complex stochastic processes can be built upon the Brownian motion using stochastic differential equations.

## Stochastic differential equations (1/3)

A *stochastic differential equation* for  $r_t$  is defined as

$$dr_t = u(r_t, t)dt + \sigma(r_t, t)dW_t \quad (41)$$

- $u$  is the generic drift (deterministic)
- $\sigma$  is the generic volatility (deterministic)
- $W_t$  is a Brownian motion (stochastic)

Every stochastic differential equation is really a shorthand for the following stochastic (Ito's) integral equation

$$r_t - r_0 = \int_0^t u(r_s, s)ds + \int_0^t \sigma(r_s, s)dW_s \quad (42)$$

## Stochastic differential equations (2/3)

We can integrate the stochastic integral equation over a short time interval  $[t_1, t_2]$ . The drift term becomes

$$u(r_1, t_1)(t_2 - t_1) \quad (43)$$

Since  $W_t$  is a Brownian motion the volatility term becomes

$$\sigma(r_1, t_1) (W_1 - W_2) = \sigma(r_1, t_1) \sqrt{t_2 - t_1} \varepsilon \quad (44)$$

where  $\varepsilon$  is a *Gaussian random* number

$$\varepsilon \sim N(0, 1) \quad (45)$$

## Stochastic differential equations (3/3)

In summary the stochastic differential equation for  $r_t$

$$dr_t = u(r_t, t)dt + \sigma(r_t, t)dW_t \quad (46)$$

can be interpreted, for a small interval  $[t, t + \Delta t]$ , as a *simulation* for the future values of  $r_{t+\Delta t}$  given the value  $r_t$

$$r_{t+\Delta t} - r_t = u(r_t, t)\Delta t + \sigma(r_t, t) \sqrt{\Delta t} \varepsilon_j \quad (47)$$

with many samples  $\varepsilon_j$ 's taken "Normally" randomly

## Example: Martingales

In the particular case of processes where  $u = 0$ ,

$$dX_t = \sigma(X_t, t)dW_t \quad (48)$$

we have a *Martingale*.

Taking an expectation of any martingale yields the current value

$$E[X_t] = X_0 \quad (49)$$

Choosing  $X_t = Y_t/N_t$  leads to the numeraire pricing equation

$$Y_0 = N_0 E \left[ \frac{Y_t}{N_t} \right] \quad (50)$$



## Example: Hull–White SDE

Consider a Stochastic differential equation describing a financial model. For example the Hull-White short-rate process defined by

$$dr_t = [\theta(t) - a r_t] dt + \sigma dW_t \quad (51)$$

Consider an option  $V$  so that the underlying short rate satisfies the Hull-White model. Proceeding with no-arbitrage arguments and using Ito's lemma it can be shown that  $V$  satisfies

$$\frac{\partial V}{\partial t} + [\theta(t) - a r] \frac{\partial V}{\partial r} + \frac{\sigma^2}{2} \frac{\partial^2 V}{\partial r^2} - r V = 0 \quad (52)$$

which is the analogous of the Black-Scholes equation for the Hull-White model

## Partial differential equations

For every model described by a stochastic differential equation, the corresponding option price  $V$  satisfies a partial differential equation

$$\frac{\partial V}{\partial t} - rV + u(r, t) \frac{\partial V}{\partial r} + \frac{\sigma(r, t)^2}{2} \frac{\partial^2 V}{\partial r^2} = 0 \quad (53)$$

- $r$  is the source term
- $u$  is the drift (a velocity field)
- $\sigma$  is the volatility (the diffusion coefficients)

Equation (53) is a parabolic partial differential equation, with the appropriate boundary and final conditions can be solved to given  $V(r, T)$

## Feynman-Kac formula

Richard Feynman (physicist) and Mark Kac (mathematician) demonstrated a result that applied to the equation

$$\frac{\partial V}{\partial t} - rV + u(r, t) \frac{\partial V}{\partial r} + \frac{\sigma(r, t)^2}{2} \frac{\partial^2 V}{\partial r^2} = 0 \quad (54)$$

with the final condition, defined by the payoff  $H$

$$V(T, r) = H(r) \quad (55)$$

Has a solution

$$V(t, r) = E \left[ e^{-\int_t^T r(s) ds} H(r) \right] \quad (56)$$

The Feynman-Kac formula is another derivation of the generic price formula. Most numerical methods use this equation.

Questions?

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## Numerical methods for interest-rate models

Even the most sophisticated interest-rate model is useless if it cannot produce at least a single number

### **Definition 1:**

An *interest-rate model* is a mathematical tool that describes interest rates in the financial markets.

### **Definition 2:**

A *numerical method* is an algorithm that is applied to a model in order to compute numerical values for the financial variables

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## Analytical formulas

*Analytical formulas* are historically the first numerical method used to compute actual numbers from financial models

In few rare and exceptional cases it is possible to find analytical solutions to derivatives models. Important examples are

- Merton formula for Black-Scholes equations
- Formulas for barrier and digital options priced in Black-Scholes model
- Discount-factor and bond-option formulas for Hull-White model

## Analytical approximations (1/2)

Even the most basic analytical solutions needs numerical methods to be evaluated. For example the cumulative normal distribution

$$N(x) = \frac{1}{\sqrt{2\pi}} \int_{-\infty}^x e^{-\frac{t^2}{2}} dt \quad (57)$$

needs to be approximated. A simple approximation is given by

$$N(x) \sim 1 - \frac{1}{\sqrt{2\pi}} e^{-x/2} (a_1 k + a_2 k^2 + a_3 k^3) \quad (58)$$

with

$$k = \frac{1}{1 + 0.33267 x} \quad (59)$$

and  $a_1 = 0.4361836$ ,  $a_2 = -0.1201676$ , and  $a_3 = 0.937298$

## Analytical approximations (2/2)

Most analytical formulas are obtained from the mathematical theory of *analytical functions*, i.e. functions that can be obtained from a locally-convergent *power series*

A fairly exhaustive collection of analytical formulas for option pricing has been compiled by *the collector*\* and can be found in

- *The Complete Guide to Option Pricing Formulas*, Espen Gaarder Haug, Mc Graw Hill (from first edition)

\*See also the interesting *picture* collection



Questions?

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## References

- *Options, future, & other derivatives*, John C. Hull, Prentice Hall (from fourth edition)
- *Efficient methods for valuing interest rate derivatives*, Antoon Pelsser, Springer Finance
- *Interest rate models: theory and practice*, D. Brigo and F. Mercurio, Springer Finance (from first edition)
- The collector web site: <http://www.espenhaug.com>