

# Lecture 24

## HJM Model for Interest Rates and Credit

Denis Gorokhov

(Executive Director, Morgan Stanley)

# Denis Gorokhov

Denis Gorokhov is an Executive Director at Morgan Stanley. During his 9 years at the firm Mr. Gorokhov worked on pricing exotic derivatives with emphasis on credit, counterparty risk, asset-backed securities, inflation, and longevity.

Mr. Gorokhov obtained a number of original analytic results for fixed income pricing problems which are implemented in Morgan Stanley risk management systems. He created a flexible modeling framework used for pricing over 400 different types of exotic derivatives including key transactions in the recent Morgan Stanley history: TARP transaction with US Treasury, purchase of 20% stake in Morgan Stanley by Mitsubishi UFJ Securities, and credit valuation adjustment with monoline insurer MBIA.

Prior to joining Morgan Stanley Mr. Gorokhov worked in the fields of superconductivity and mesoscopic physics and authored 20 papers in leading physics journals. Mr. Gorokhov holds a Ph.D. degree in theoretical physics from ETH-Zurich and spent several years as a post-doctoral researcher at Harvard and Cornell.

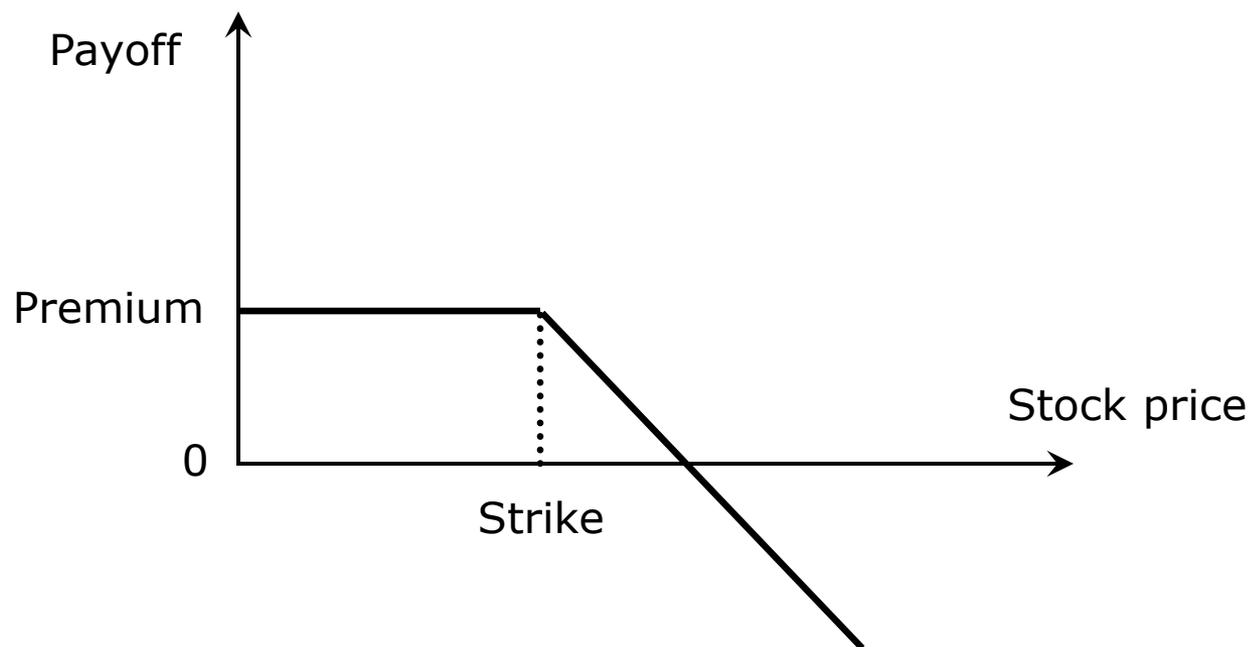
Mr. Gorokhov's comments today are his own, and do not necessarily represent the views of Morgan Stanley or its affiliates, and are not a product of Morgan Stanley Research.

# Introduction

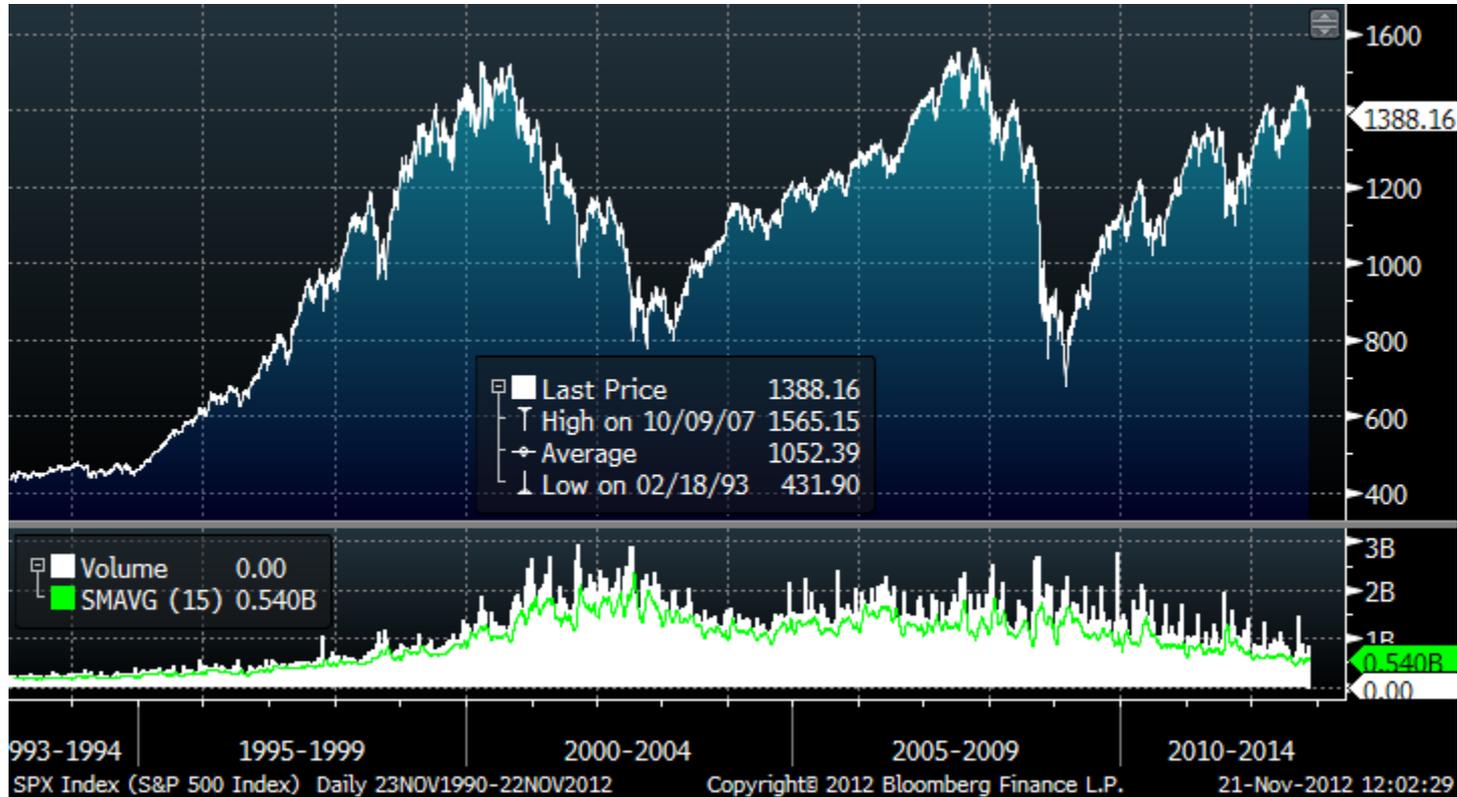
- HJM (Heath-Jarrow-Morton) model is a very general framework used for pricing interest rates and credit derivatives.
- Big banks trade hundreds, sometimes even thousands, of different types of derivatives and need to have a modeling/technological framework which can quickly accommodate new payoffs.
- Compare this problem to that in physics. It is relatively straightforward to solve Schrodinger equation for the hydrogen atom and find energy levels. But what about energy spectra of complicated molecules or crystals? Physicists use advanced computational methods in this case, e.g. LDA (local density approximation).
- Similarly, in the world of financial derivatives there is a very general framework, Monte Carlo simulation, which in principle can be used for pricing any financial contract.
- The HJM model naturally fits into this concept.
- Before discussing the HJM model it is very important to understand how the Monte Carlo method appears in finance. Stock options are the best example.

# Dynamic Hedging

- Dealers are trying to match buy and sell orders from clients. It is not always possible and they have to hedge the residual positions.
- In the example below a dealer sold a call option on a stock, the loss may be unlimited. To hedge the exposure the dealer takes a position in an underlying and adjusts it dynamically.



# Stock Price Dynamics



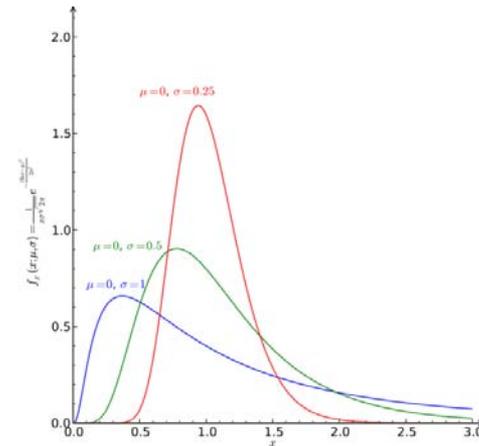
S&P-500 index, 1990 - 2012

# Lognormal Stochastic Process

- Usually stock dynamics is assumed to be a sum of drift and diffusion and a lognormal stochastic process is a good first approximation.
- For this process one can calculate the probability distribution function exactly. This is why the price of the call option in the Black-Scholes model can be calculated analytically.
- The probability distribution function is Gaussian in the log coordinates.

$$dS = \mu S dt + \sigma S dB_t$$

$$P(S_T, S_t; T - t) = \frac{1}{\sqrt{2\pi\sigma S_t}} \exp \left[ - \left( \ln \frac{S_t}{S_T} + \left( \mu - \frac{1}{2} \sigma^2 \right) (T - t) \right)^2 \frac{1}{2\sigma^2 (T - t)} \right]$$



# Black-Scholes Formalism

- Usually derivation of the Black-Scholes equation is based on the result from stochastic calculus known as Ito's lemma.
- Roughly speaking, Ito's lemma says that the derivative of a stochastic function with respect to time has an additional *deterministic* term.
- One can create a portfolio consisting of an option and a position in the underlying (hedge) which is riskless (thanks to Ito's lemma).

$$dC = \frac{\partial C}{\partial t} dt + \frac{\partial C}{\partial S} dS + \frac{1}{2} \sigma^2 S^2 \frac{\partial^2 C}{\partial S^2} dt, \quad C = C(S, t)$$

$$\Pi = C - \Delta S, \quad \text{choose } \Delta = \frac{\partial C}{\partial S}$$

$$d\Pi = dC - \Delta dS = r(C - \Delta S)dt, \quad \text{portfolio is riskless}$$

$$\frac{\partial C}{\partial t} + \frac{1}{2} \sigma^2 S^2 \frac{\partial^2 C}{\partial S^2} + rS \frac{\partial C}{\partial S} - rC = 0, \quad r = \text{interest rate}$$

# Black-Scholes Miracle

- There are 2 striking facts about the Black-Scholes equation.
- First, the drift of the stock does not show up in the BS equation. It happens because we hedge the option with the stock.
- Second, the risk is eliminated *completely*, i.e. by holding a certain position in underlying we can fully replicate the option. This is closely related to the *deterministic* second-order term in Ito's lemma. It is worth analyzing it in detail.

$$\frac{\partial C}{\partial t} + \frac{1}{2} \sigma^2 S^2 \frac{\partial^2 C}{\partial S^2} + rS \frac{\partial C}{\partial S} - rC = 0$$

# Ito's Lemma under Microscope

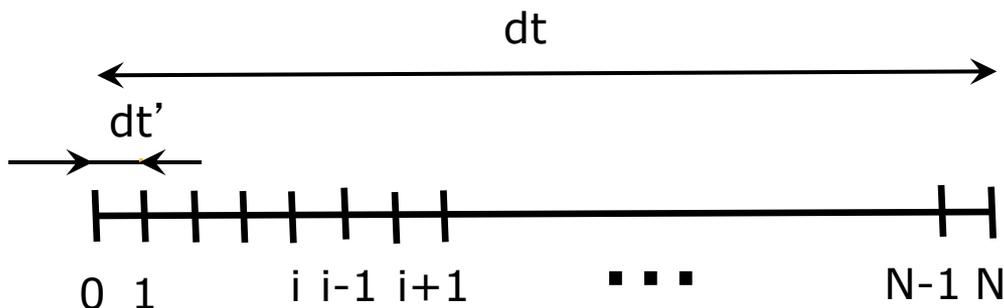
$$S_{i+1} - S_i = \mu S_i dt' + \sigma S_i \varepsilon_i \sqrt{dt'}, \quad \varepsilon_i \sim N(0,1)$$

$$C(S_{i+1}, t_{i+1}) - C(S_i, t_i) \approx \frac{\partial C}{\partial t} dt' + \frac{\partial C}{\partial S} (S_{i+1} - S_i) + \frac{1}{2} \frac{\partial^2 C}{\partial S^2} (S_{i+1} - S_i)^2, \quad i = 0 \dots N-1,$$

$$C(S_{i+1}, t_{i+1}) - C(S_i, t_i) \approx \frac{\partial C}{\partial t} dt' + \frac{\partial C}{\partial S} (S_{i+1} - S_i) + \frac{1}{2} \frac{\partial^2 C}{\partial S^2} \sigma^2 S_i^2 \varepsilon_i^2 dt'$$

$$C(S_N, t_N) - C(S_0, t_0) \approx \frac{\partial C}{\partial t} dt + \sum_i \frac{\partial C}{\partial S} (S_i, t_i) (S_{i+1} - S_i) + \frac{1}{2} \frac{\partial^2 C}{\partial S^2} \sigma^2 S^2 \sum_i \varepsilon_i^2 dt'$$

- In the limit  $N \rightarrow \infty$  the sum in the last term of the last equation becomes *deterministic* and we obtain Ito's lemma!



# Black-Scholes Miracle - 2

- Exercise 1: Prove that  $\sum_{i=1}^N \varepsilon_i^2$ ,  $\varepsilon_i \sim N(0,1)$  is deterministic in the limit  $N \rightarrow \infty$ .
- Exercise 2: Look up a “proof” of Ito’s lemma in Hull’s book (J.C. Hull, *Options, Futures, and Other Derivatives*) and find an error (pages 232-233 in 5<sup>th</sup> edition).
- We see that complete risk elimination in the Black-Scholes model is due to the existence of 2 different time scales  $dt$  and  $dt'$ . One can derive the BS equation in the limit  $dt \rightarrow 0$ ,  $dt' \rightarrow 0$ , and  $dt/dt' \rightarrow \infty$ .
- From the business point of view this means that we hedge on a small time scale  $dt'$  and the profit/loss noise is finite, however as long as the time interval increases to  $dt$  the profit/loss noise disappears!

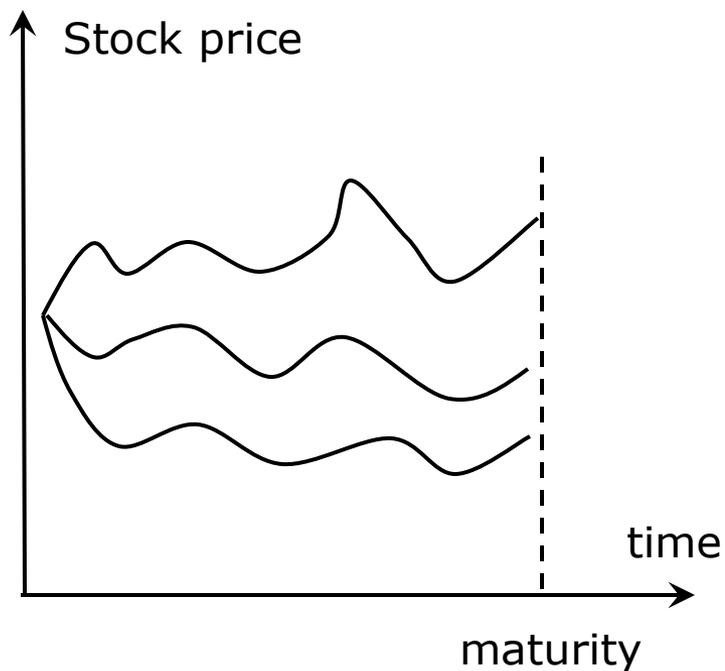
# Solving Black-Scholes Equation

$$\frac{\partial C}{\partial t} + \frac{1}{2} \sigma^2 S^2 \frac{\partial^2 C}{\partial S^2} + rS \frac{\partial C}{\partial S} - rC = 0$$

$$C(S, t) = \exp(-r(T-t)) \int \frac{dS'}{\sqrt{2\pi\sigma S'}} \exp\left[-\left(\ln \frac{S}{S'} + \left(r - \frac{1}{2}\sigma^2\right)(T-t)\right)^2 \frac{1}{2\sigma^2(T-t)}\right] \text{Payoff}(S')$$

- BS equation is similar to the heat equation and can be solved using standard methods.
- The Green function in the solution above is strikingly similar to the probability distribution function of the lognormal distribution shown above.
- The 2 expressions differ only by the discount factor as well as the stock drift substituted by interest rate  $r$ .

# Interpretation: Monte Carlo Simulation Concept



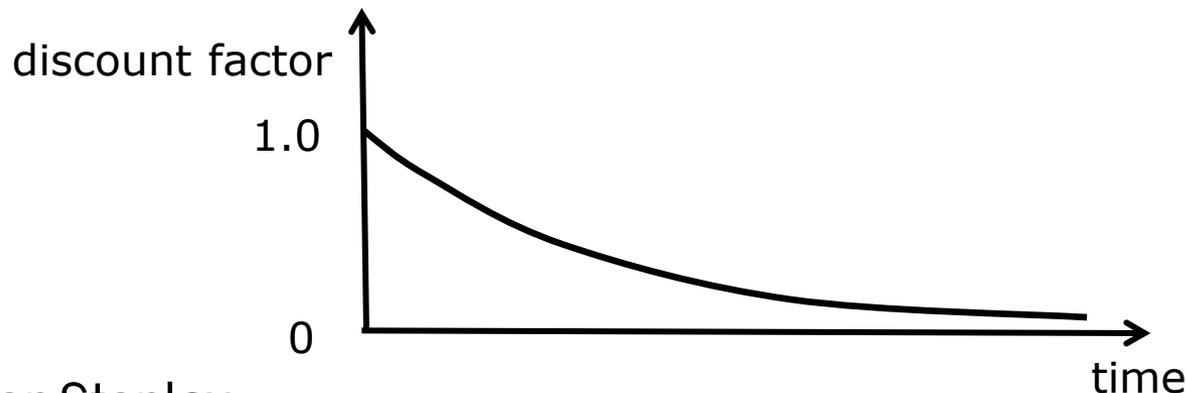
$$dS = rSdt + \sigma SdB_t$$

$$C(S, t) = e^{-r(T-t)} E(\text{Payoff}(S_T))$$

- One needs to simulate different stock paths in the *risk-neutral* world, calculate the average of the payoff, and discount.
- It turns out that this approach works not just for equity derivatives but can be generalized for interest and credit cases as well.
- Every security in the risk-neutral world grows on average with the risk free rate.

# Interest Rates Derivatives: Basic Concepts

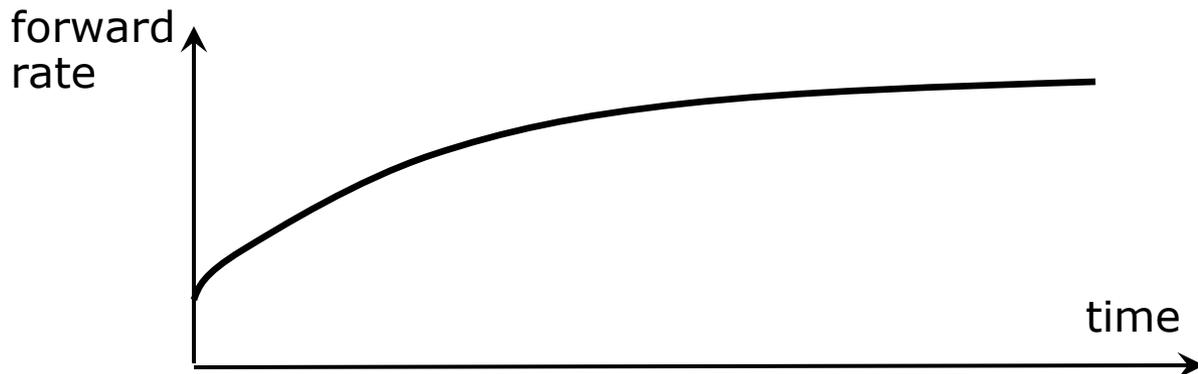
- Businesses borrow money to finance their activity.
- As a compensation lenders charge borrowers certain interest.
- Interest rates fluctuate with time and, similar to the equity case, there exists a market of derivatives linked to the level of interest rates.
- Time value of money: \$1 to be paid in 1 year from now is worth less than \$1 paid in 2 years from now. For example, if 1- and 2-year interest rates are both equal to 5%, then one needs to invest  $\$1/(1+0.05) = \$0.95$  today to obtain \$1 in 1 year from now and  $\$1/(1+0.05)^2 = \$0.90$  to obtain \$1 in 2 years from now.
- It is very convenient to describe time value of money using discount factors.



# Forward Rates

- It is very convenient to express discount factors using forward rates.
- Mathematically, the relation between discount factors and forward rates can be expressed as

$$d(t, T) = \exp\left(-\int_t^T f(t, s) ds\right)$$



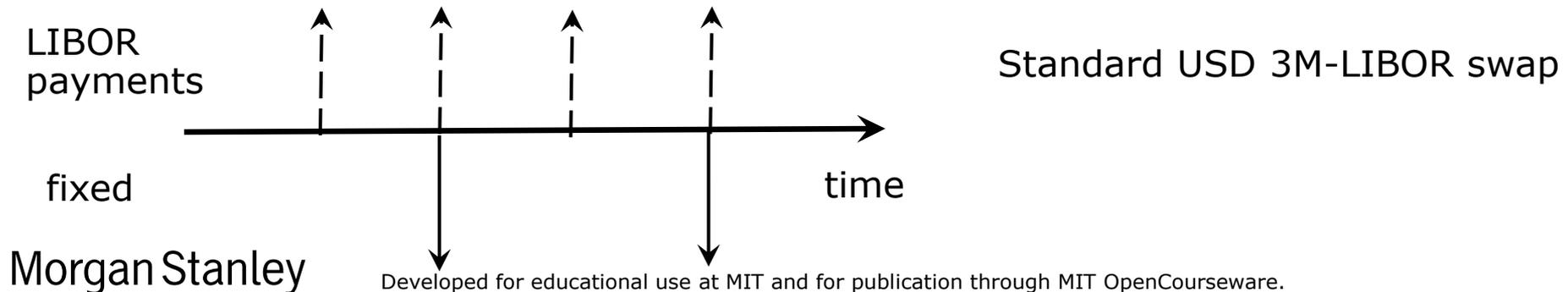
# Yield of 10-year US Treasury Note



- Interest rates are extremely low at present.

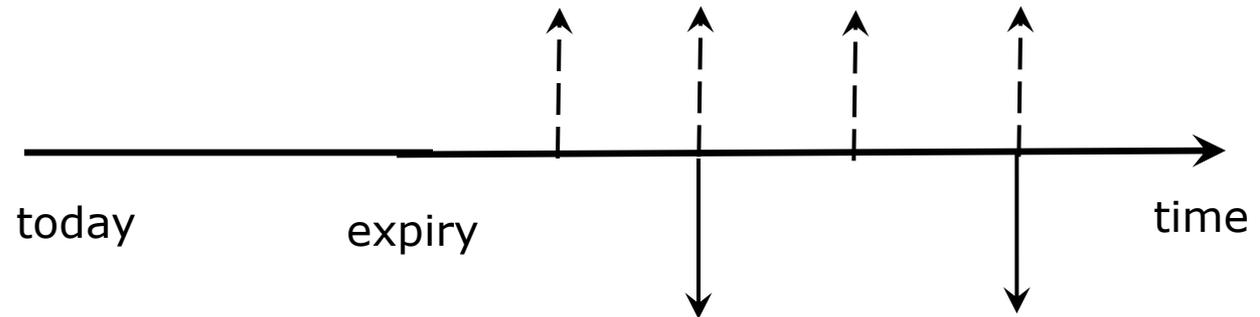
# Libor Rates

- LIBOR rate is a fundamental rate in the world of interest rate derivatives. This rate is used an important benchmark in the world of lenders/borrowers. Very often borrow rates are quoted as a spread over LIBOR.
- Roughly speaking, USD LIBOR (London Interbank Exchange Offer) rate is the rate at which well rated banks lend US dollars to each other in London for a short term on unsecured basis.
- There exist liquid 1M, 3M, 6M, and 12M LIBOR rates in different currencies.
- *LIBOR swap* is a fundamental interest rates derivative. The first counterparty makes periodic LIBOR payments, while the second one pays predetermined fixed rate.



# Interest Rate Derivatives

- Besides standard interest rate swaps there exist numerous types of interest rate derivatives. They are used for risk management of interest rate exposure.
- European swaption: An option to enter a forward starting LIBOR Swap.



- Libor caps/floors: Essentially put/call options on LIBOR rate in the future.
- Cancellable swaps: One of the parties has a right to cancel the LIBOR swap.

# LIBOR Swap Quotes

recal: manual  Close Rates FULL CALC QUICK CALL  
 spline: AMGcdf  Feed:  Actions ZCS

init float setting

shortcode	quote	spread
STSCD=3M: 0M	0.319173	0.0000
STSCD=3M: 20121219	0.316400	0.0000
IRF=EDZ2	99.6875	-0.3400
IRF=EDH3	99.6875	-0.6800
IRF=EDM3	99.6775	-1.0000
IRF=EDU3	99.6625	-1.2800
IRS=2Y	0.244000	11.7500
IRS=3Y	0.330000	11.5000
IRS=4Y	0.477000	9.7500
IRS=5Y	0.624000	13.5000
IRS=7Y	1.018000	13.2500
IRS=10Y	1.588000	3.7500
IRS=12Y	1.588000	27.7500
IRS=15Y	1.871000	23.5000
IRS=20Y	2.155000	15.0000
IRS=30Y	2.724000	-26.0000
IRS=40Y	2.724000	-22.7500
IRS=50Y	2.724000	-22.7500

display: zeros

maturity	zeros
1M	0.298208
2M	0.303480
3M	0.308463
6M	0.313247
9M	0.317016
1Y	0.326287
2Y	0.398446
3Y	0.481914
5Y	0.819451
7Y	1.239432
10Y	1.765997
20Y	2.533328

EffDate : 11/27/12  
 CookedAsOf: 11/23/12  
 FixFreq : 2  
 Fix DCB : 30360  
 CD DCB : Act360  
 YC : usdn\_3m  
 InitDecomp: NO  
 Underlying: usdn\_6m

Modified : sts  
 22-Nov-12 01:28:42  
 Modified Privately:

# Pricing LIBOR Swaps, Discount Curve Cooking

- The LIBOR swap consists of 2 streams: fixed and floating ones. They can be priced if we know the discount factor curve  $d=d(t)$ .
- The present value of a fixed payment  $C$  paid at time  $t$  is given by

$$PV_{fixed} = Cd(t)$$

- There is a very neat result: present value of the float leg of a LIBOR swap plus a notional payment at the end is equal to the notional. The PV of the swap receiving fixed, paying float, and maturing at time  $T$  is

$$PV(T) = \sum_i cNd(t_i) + Nd(T) - N$$

- But where from do we know the discount function  $d(t)$ ? The swap market is very liquid and we know swap rates corresponding to different maturities. One can reverse engineer curve  $d(t)$  so that the observed swap rates are *fair* rates, i.e. for all swaps  $PV(T)=0$ .
- This procedure is known as discount curve bootstrapping (“cooking”).
- Note: Here, we do not take into account OIS discounting.

# Pricing Interest Rate Derivatives

- In order to price a stock option one needs to know the stock value today as well as future stock dynamics.
- The Monte Carlo simulation framework allows to calculate the price.
- It turns out that the same framework can be used for pricing interest rate derivatives. However, there is a very important distinction: while stock evolution is a point-like process, in the interest rate world we interested in dynamics of a curve, i.e. a one-dimensional object. The problem is more complicated.

	STOCK OPTIONS	IR OPTIONS
INITIAL VALUE	known	not known, curve needs to be cooked
DYNAMICS	point-like object	One-dimensional object

# Classes of Interest Rates Models

- Dynamic interest rates models can be divided into 2 large classes: term structure models and short rate models.
- The first class of models (more general) describes the dynamics of the full forward curve, while the second class describes the short term rates only. Here is the list of the most famous short rates models:

$$dr_t = \theta_t dt + \sigma dB_t$$

Ho-Lee model

$$dr_t = (\theta_t - \alpha r_t) dt + \sigma dB_t$$

Hull-White model

$$dr_t = (\theta_t - \alpha r_t) dt + \sigma \sqrt{r_t} dB$$

Cox-Ingersoll-Ross (CIR) model

- Note that the short rate and forward rates are related via

$$r_t = f_{tt}$$

# HJM (Heath-Jarrow-Morton) Framework

- The HJM model shows how to describe the evolution of forward rates. The starting equation is again a sum of drift and diffusion terms. Note that each forward rate depends on 2 variables  $t$  and  $T$ , not just  $t$  as in the stock options case

$$df_{tT} = \mu_{tT} dt + \sigma_{tT} dB_t$$

- Consider the price evolution of a zero coupon bond (it pays \$1 at time  $T$ ). In the risk-neutral world the price of the bond should grow with the risk-free rate on average

$$Z_{tT} = \exp\left(-\int_t^T f_{ts} ds\right) \equiv \exp(-X_t)$$

$$dX_t = -f_{tt} dt - \int_t^T df_{ts} ds = -f_{tt} dt - \left(\int_t^T \mu_{ts} ds\right) dt - \left(\int_t^T \sigma_{ts} dB_t\right) ds$$

$$\text{Ito's lemma : } dZ_{tT} = de^{-X_t} = -e^{-X_t} dX_t + \frac{1}{2} \left(\int_t^T \sigma_{ts} ds\right)^2 e^{-X_t} dt =$$

$$= f_{tt} Z_{tT} - \left(\int_t^T \sigma_{ts} ds\right) Z_{tT} dB_t + \frac{1}{2} \left(\int_t^T \sigma_{ts} ds\right)^2 Z_{tT} dt - \left(\int_t^T \mu_{ts} ds\right) Z_{tT} dt$$

# HJM Framework - 2

- On the previous slide we have shown that

$$dZ_{tT} = f_{tt}Z_{tT} - \left(\int_t^T \sigma_{ts} ds\right)Z_{tT}dB_t + \frac{1}{2}\left(\int_t^T \sigma_{ts} ds\right)^2 Z_{tT}dt - \left(\int_t^T \mu_{ts} ds\right)Z_{tT}dt$$

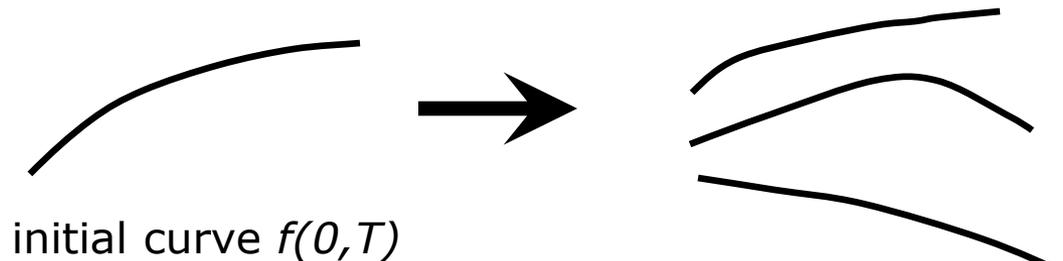
- First of all, the forward rate  $f(t,t)$  is equal to the short rate  $r(t)$ . Second, in order for the bond price to grow on average with the risk-free rate, the sum of the last 2 terms in the equation above should be equal to zero, i.e.

$$\mu_{tT} = \sigma_{tT} \int_t^T \sigma_{ts} ds$$

- This equation allows to simulate interest rates and price interest rates derivatives in a Monte Carlo simulation.

# HJM Model Summary: How to Price IR Derivatives

- Take IR swap quotes and bootstrap the discount curve.
- Obtain forward rates from the discount curve. This is the starting point of the simulation.
- Specify the volatility of forward rates.
- If the volatility is known, the drift can be calculated.
- Start the simulation, stop at maturity, and price the derivative value by averaging and discounting, similar to the stock option case.
- IR volatility can be calibrated from the swaptions market.



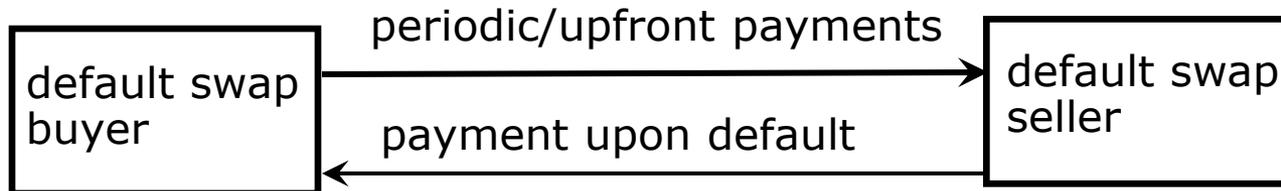
simulated curves at maturity

$$df_{tT} = \sigma_{tT} \left( \int_t^T \sigma_{ts} ds \right) dt + \sigma_{tT} dB_t$$

$$PV_t = E \left( e^{-\int_0^t f_{ss} ds} \text{Payoff}(t) \right)$$

# Credit Derivatives: a Quick Introduction

- When a borrower issues debt, there is a chance that money will not be returned.
- This type of risk is known as credit risk and needs to be taken into account.
- The higher the default risk for a particular issuer, the higher interest rate is charged by the borrowers.
- The interest rate can vary a lot among different issuers. For example, for 10-year debt, the US government pays 1.7%/year (essentially, default-free rate), Morgan Stanley pays around 5%/year, while the effective yield of bonds issued by Greece is in the range 25-30%.
- There exists a large credit derivatives market. The most important instrument is credit default swap.



- In the event of default of a reference entity, seller pays the loss on a bond.

# Survival Probabilities and Hazard Rates

- It is very convenient to describe credit derivatives in terms of implied survival probabilities. Let us illustrate this using a credit default swap example.
- Assume that credit default swap protects against default on a bond with notional  $N$  and recovery  $R$ . Assume for simplicity that interest rate is zero.

$$cN = (1 - R)(1 - p)N$$

$c$  = upfront coupon,  $N$  = notional,  $R$  = recovery,  $p$  = survival prob.

$$p = 1 - \frac{c}{1 - R}$$

- It is very convenient to parameterize survival probabilities with hazard rates. Similar to the IR case one can write

$$p(t, T) = \exp\left(-\int_t^T h(t, s) ds\right)$$

# Pricing Credit Derivatives

- Remember that in the IR case one could price all derivatives using discount curve  $d(t)$  whose meaning is the value of \$1 paid at time  $t$  from now.
- In the world of credit derivatives there is a notion of risky discount factors, i.e. the value of \$1 paid in the future subject to a possible default of a reference entity.
- Similar to the IR case one can “cook” survival probabilities from CDS market.
- The present value of a CDS paying a loss on a bond can be written as follows

$$PV = \sum_i aNd(t_i)p(t_i) - (1-R)N \sum_i (p_{i-1} - p_i)d_i, \text{ a = running coupon}$$

# Dynamic Hazard Rate Model

- In the case of credit default swaps pricing is relatively simple.
- There are credit-linked instruments depending not only on survival probabilities but also on their volatility, e.g. callable bonds.
- Correct modeling of interest rate and credit dynamics allows to make optimal call decisions.
- Here is an example:

corporation X issues a 10y \$100MM bond

risk free rate = 2.00%

credit spread = 3.00%

effective spread = 5.00%

in 3y the market changes

risk free rate = 1.50%

credit spread = 1.50%

effective spread = 3.0%

the company decided to refinance,

savings are  $2\% * \$100\text{MM} * 7\text{years} = \$14\text{MM}$

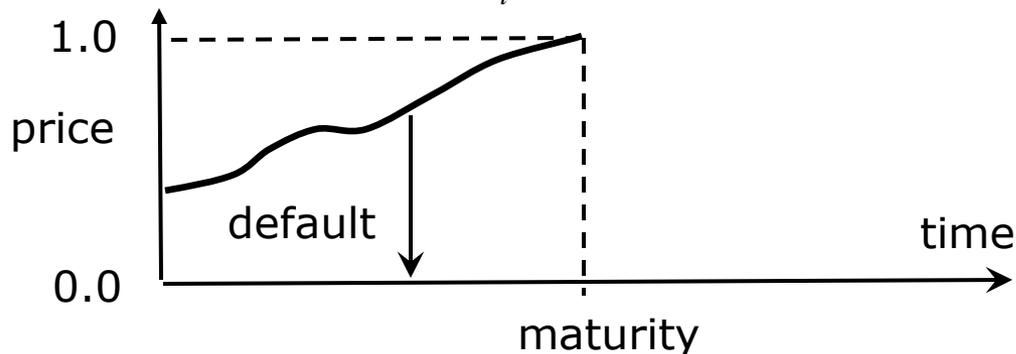
# Modeling Dynamics of Hazard Rates

- Similar to the IR case we assume that dynamics of forward hazard rates can be described by a sum of drift and diffusion terms.
- In order to describe dynamics of hazard rates it is very convenient to consider price evolution of a zero coupon bond with no recovery.

$$df_{tT} = \mu_{tT} dt + \sigma_{tT} dB_t$$

$$dh_{tT} = \mu_{tT}^h dt + \sigma_{tT}^h dB_t^h$$

$$Z_{tT} = 1_{\{t < \tau\}} \exp\left(-\int_t^T (f_{ts} + h_{ts}) ds\right), \tau = \text{default time}$$



# Drift Condition for Hazard Rates

- Exercise 3: Derive a drift expression for the credit HJM model.
- Hint: Consider dynamics of a zero coupon bond and average over the default event. The resulting drift in this case should be equal to the risk-free rate. This leads to a condition for the drift of forward hazard rates.
- If there are no correlations between IR and hazard rates, the drift is given by the equation similar to the IR case.

$$dh_{tT} = \sigma_{tT}^h \int_t^T \sigma_{tT}^h ds + \sigma_{tT}^h dB_t$$

- In summary, we have shown how to price exotic derivatives using Monte Carlo simulations. One needs to write stochastic differential equations with the correct drift (to make sure all assets grow with risk-free rate on average), simulate equity/IR/credit paths, and (in the European option case) average/discount payoff

# Example: Structured Notes

- Investors are looking for attractive yields on their capital.
- Nowadays investing into Treasury bonds is not very attractive. The 10 year bond generates just 1.7% per year. After taxes the investor is left with just 1.1% return which is well below current inflation rate (1.5-2%).
- Investors can increase their return by buying corporate bonds and, hence, bearing credit risk. In this case one can easily generate a 5-6% nominal return before taxes (Morgan Stanley case). But can we go even higher than that without bearing too much credit risk?
- Structured note is a bond issued by institutions whose coupon can be very exotic. Here is a typical example.

corporation X issues a 10 year \$100MM structured note

coupon =  $10\% \times \frac{\text{number of days condition is satisfied}}{\text{total number of days}}$

condition = (30 - year swap rate > 2 - year swap rate) & & (S & P - 500 index > 880)

# Structured Notes: Coupon Enhancement

- The bond holder bears tail risk: The historical probability of events is low but the market implied probability of them is significant, so that the investor can obtain a coupon enhancement.
- What will the institution who sold the bond do? First, the note is priced using a Monte Carlo simulation which was described in the presentation. Next, deltas with respect to equity, rates, and credit will be calculated and the note will be hedged accordingly.
- For the described structured note the breakdown of the condition implies a very severe recession.

# 30y swap rate – 2y swap rate



- During the last decade the 30y-2y difference was negative only for a few days on Feb 2006 but the market implies that for the next decade it will be the case for nearly 80% of days.
- Similarly, S&P-500 was above 880 for 94% of days, however the implied frequency is only about 75% for the next decay.

# Disclosures

The information herein has been prepared solely for informational purposes and is not an offer to buy or sell or a solicitation of an offer to buy or sell any security or instrument or to participate in any trading strategy. Any such offer would be made only after a prospective participant had completed its own independent investigation of the securities, instruments or transactions and received all information it required to make its own investment decision, including, where applicable, a review of any offering circular or memorandum describing such security or instrument, which would contain material information not contained herein and to which prospective participants are referred. No representation or warranty can be given with respect to the accuracy or completeness of the information herein, or that any future offer of securities, instruments or transactions will conform to the terms hereof. Morgan Stanley and its affiliates disclaim any and all liability relating to this information. Morgan Stanley, its affiliates and others associated with it may have positions in, and may effect transactions in, securities and instruments of issuers mentioned herein and may also perform or seek to perform investment banking services for the issuers of such securities and instruments.

The information herein may contain general, summary discussions of certain tax, regulatory, accounting and/or legal issues relevant to the proposed transaction. Any such discussion is necessarily generic and may not be applicable to, or complete for, any particular recipient's specific facts and circumstances. Morgan Stanley is not offering and does not purport to offer tax, regulatory, accounting or legal advice and this information should not be relied upon as such. Prior to entering into any proposed transaction, recipients should determine, in consultation with their own legal, tax, regulatory and accounting advisors, the economic risks and merits, as well as the legal, tax, regulatory and accounting characteristics and consequences, of the transaction.

Notwithstanding any other express or implied agreement, arrangement, or understanding to the contrary, Morgan Stanley and each recipient hereof are deemed to agree that both Morgan Stanley and such recipient (and their respective employees, representatives, and other agents) may disclose to any and all persons, without limitation of any kind, the U.S. federal income tax treatment of the securities, instruments or transactions described herein and any fact relating to the structure of the securities, instruments or transactions that may be relevant to understanding such tax treatment, and all materials of any kind (including opinions or other tax analyses) that are provided to such person relating to such tax treatment and tax structure, except to the extent confidentiality is reasonably necessary to comply with securities laws (including, where applicable, confidentiality regarding the identity of an issuer of securities or its affiliates, agents and advisors).

The projections or other estimates in these materials (if any), including estimates of returns or performance, are forward-looking statements based upon certain assumptions and are preliminary in nature. Any assumptions used in any such projection or estimate that were provided by a recipient are noted herein. Actual results are difficult to predict and may depend upon events outside the issuer's or Morgan Stanley's control. Actual events may differ from those assumed and changes to any assumptions may have a material impact on any projections or estimates. Other events not taken into account may occur and may significantly affect the analysis. Certain assumptions may have been made for modeling purposes only to simplify the presentation and/or calculation of any projections or estimates, and Morgan Stanley does not represent that any such assumptions will reflect actual future events. Accordingly, there can be no assurance that estimated returns or projections will be realized or that actual returns or performance results will not be materially different than those estimated herein. Any such estimated returns and projections should be viewed as hypothetical. Recipients should conduct their own analysis, using such assumptions as they deem appropriate, and should fully consider other available information in making a decision regarding these securities, instruments or transactions. Past performance is not necessarily indicative of future results. Price and availability are subject to change without notice.

The offer or sale of securities, instruments or transactions may be restricted by law. Additionally, transfers of any such securities, instruments or transactions may be limited by law or the terms thereof. Unless specifically noted herein, neither Morgan Stanley nor any issuer of securities or instruments has taken or will take any action in any jurisdiction that would permit a public offering of securities or instruments, or possession or distribution of any offering material in relation thereto, in any country or jurisdiction where action for such purpose is required. Recipients are required to inform themselves of and comply with any legal or contractual restrictions on their purchase, holding, sale, exercise of rights or performance of obligations under any transaction.

Morgan Stanley does not undertake or have any responsibility to notify you of any changes to the attached information.

With respect to any recipient in the U.K., the information herein has been issued by Morgan Stanley & Co. International Limited, regulated by the U.K. Financial Services Authority. THIS COMMUNICATION IS DIRECTED IN THE UK TO THOSE PERSONS WHO ARE MARKET COUNTERPARTIES OR INTERMEDIATE CUSTOMERS (AS DEFINED IN THE UK FINANCIAL SERVICES AUTHORITY'S RULES).

ADDITIONAL INFORMATION IS AVAILABLE UPON REQUEST.

MIT OpenCourseWare  
<http://ocw.mit.edu>

18.S096 Topics in Mathematics with Applications in Finance  
Fall 2013

For information about citing these materials or our Terms of Use, visit: <http://ocw.mit.edu/terms>.