

TIME-VARYING CREDIT RISK AND LIQUIDITY PREMIA IN BOND AND CDS MARKETS

Wolfgang Bühler and Monika Trapp

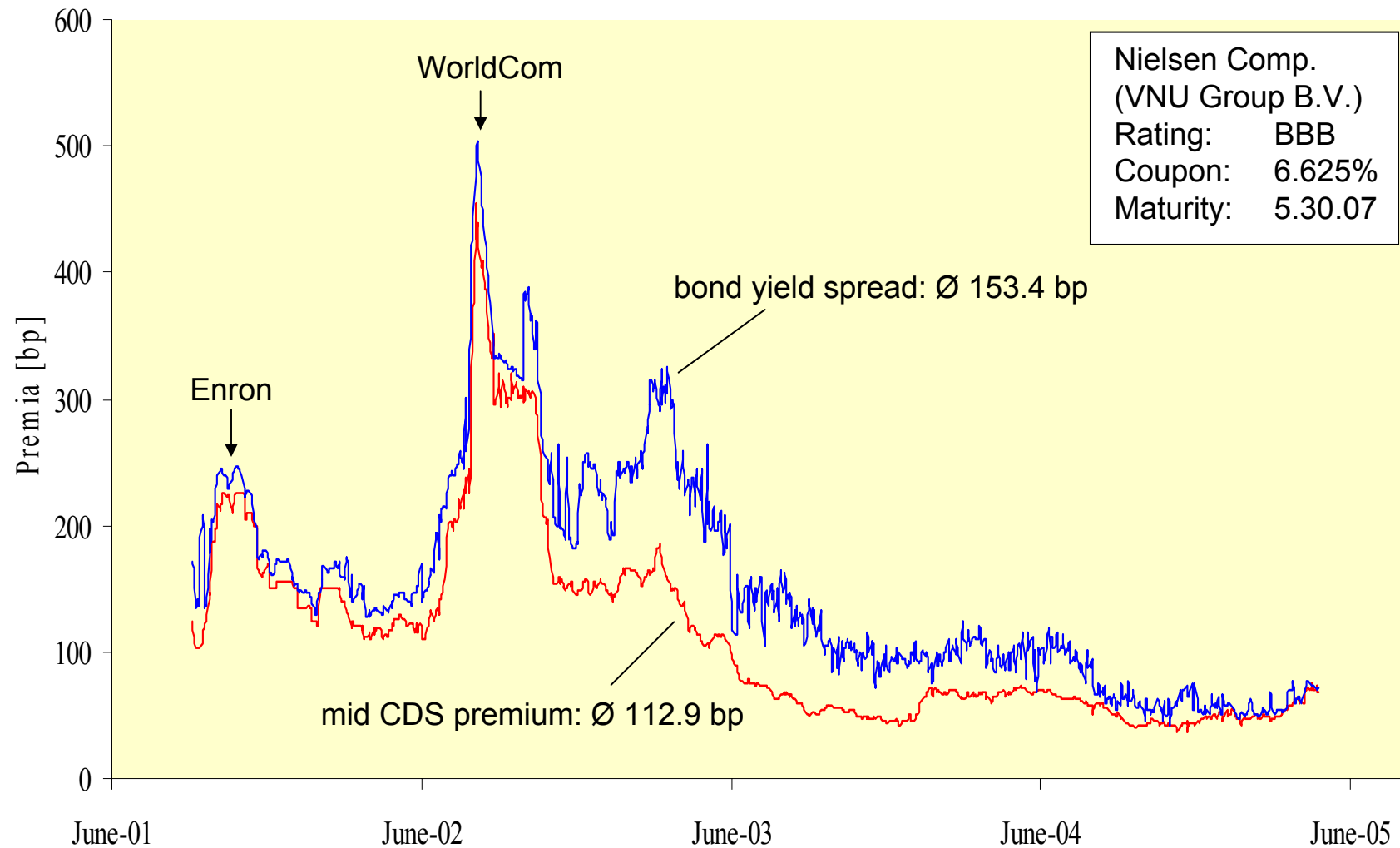
University of Mannheim

International Financial Research Forum

Paris, March 27, 2008

I. Motivation

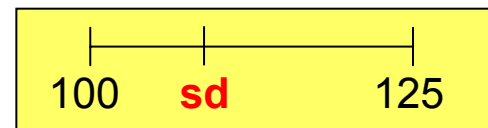
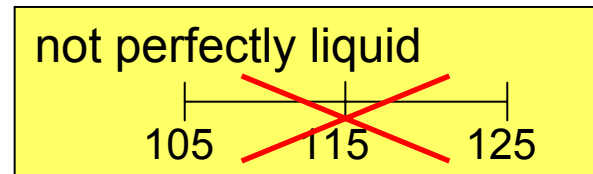
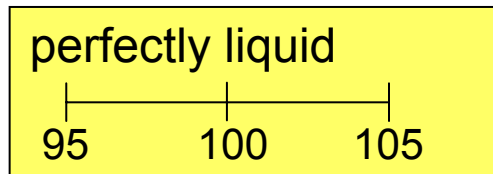
BOND SPREADS AND CDS PREMIA



CONTRIBUTION

- CDS **not** liquidity-risk free

different effects in bond and CDS markets



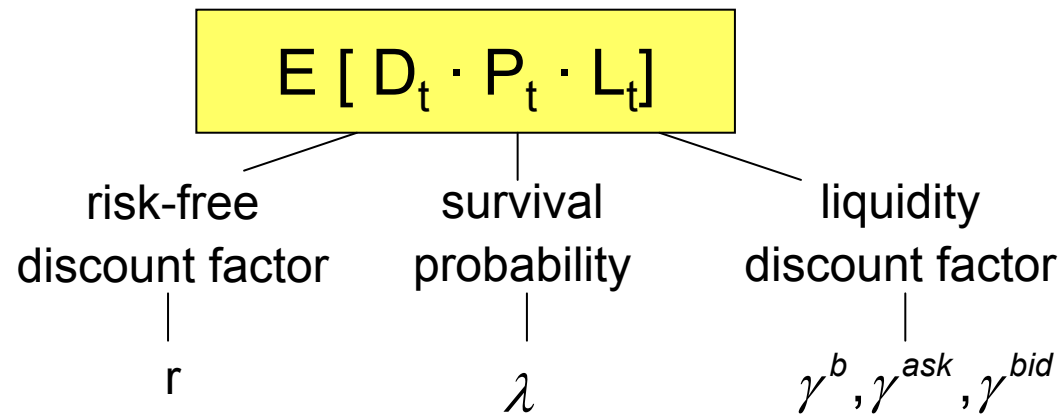
- illiquidity spillover from bond market in case of default
- reduced-form model for both markets
 - identical credit-risk rates**
 - bond and CDS bid/ask liquidity rates**
- liquidity-risk free bond yield spread and CDS premium
- empirical analysis of credit risk, liquidity, and correlation premia

FINDINGS

- consistently **positive** liquidity premia in bond market (Longstaff et al. 05)
- bond spread partition :
 - 60% credit risk
 - 35% liquidity
 - 5% correlation (Elton et al. 01, Huang/Huang 03)
- CDS market :
 - 95% credit risk
 - 4% liquidity
 - 1% correlation (Tang/Yan 07, Nashikkar et al. 07)
- **time-varying** credit risk, liquidity, and correlation premia
- illiquidity **positively** related with credit risk (Ericsson/Renault 06)
 - **cross-sectional** relation of premia
 - **changes** of illiquidity and credit risk
 - bond liquidity dries up if credit risk increases, CDS depends on rating
- bond and CDS liquidity premia **negatively** related

THE MODEL

- reduced-form model



- 5-factor risk structure:

- independent latent factors $r, x, y^b, y^{ask}, y^{bid}$

- $\lambda, \gamma^b, \gamma^{ask}, \gamma^{bid}$ linear functions of latent factors

⇒ **direct** correlation of credit risk and liquidity (via x & y)

⇒ **direct** (via x) **and indirect** (via y) correlation of bond & CDS liquidity

THE MODEL

BOND PRICE

Bond Price:

$$c \cdot \sum_{i=1}^n E_t \left[D(t_i) \cdot P(t_i, x_{t_0}; f) \cdot L(t_i, y_{t_0}^b; g) \right] + E_t \left[D(t_n) \cdot P(t_n, x_{t_0}; f) \cdot L(t_n, y_{t_0}^b; g) \right] \\ + R \cdot \sum_{j=1}^N E_t \left[D(\theta_j) \cdot \Delta P(\theta_j, x_{t_0}; f) \cdot L(\theta_j, y_{t_0}^b; g) \right]$$

CDS ASK PREMIUM

Fixed Leg :

$$S^{ask} \cdot \left(\sum_{i=1}^m E_t \left[D(T_i) \cdot P(T_{i-1}, x_{T_0}; f) \cdot L(T_i, y_{T_0}^{ask}; g) \right] + \sum_{j=1}^M E_t \left[\delta_j D(\theta_j) \cdot \Delta P(\theta_j, x_{t_0}; f) \right] \right)$$

Floating Leg :

$$\sum_{j=1}^M E_t \left[D(\theta_j) \cdot \Delta P(\theta_j, x_{t_0}; f) \cdot \left[1 - R \cdot L(\theta_j, y_{t_0}^b; g) \right] \right]$$

CREDIT RISK, LIQUIDITY, AND CORRELATION PREMIA

BOND:

credit spread: **par** bond price ($y^b = f = g = 0$) $=: \sum_i CF_{t_i} (1 + y + bd)^{-t_i}$

liquidity spread: **par** bond price ($y^b, f = g = 0$) $=: \sum_i CF_{t_i} (1 + y + bd + bl)^{-t_i}$

correlation spread: **par** bond price (y^b, f, g) $=: \sum_i CF_{t_i} (1 + y + bd + bl + bc)^{-t_i}$

CDS:

credit spread: premium **sd** $s(y^b, y^{ask/bid} = f = g = 0)$

liquidity spread: premium **sl** mid premium ($y^b, y^{ask}, y^{bid}, f = g = 0$) $- sd$

correlation spread: premium **sc** mid premium ($y^b, y^{ask}, y^{bid}, f = g = 0$) $- sd - sl$

market pressure on **demand** side $\Rightarrow ask \uparrow \Rightarrow sl \uparrow$
 $\Rightarrow sd$ closer to bid side

DATA AND EMPIRICAL DESIGN

- period 06/01 to 07/07 ; daily data; firm-specific estimation
- risk-free term structure of interest rates : German Gov't Bonds
- CDS : large US investment bank (quotes, transaction prices); 5 yrs
bonds : Bloomberg (mid prices), average notch rating AAA-CCC

Step 1: process parameter values for x , y^b , y^{ask} , y^{bid} , correlation f , g

Step 2: estimation of time series $(x_t, y_t^b, y_t^{\text{ask}}, y_t^{\text{bid}})$, $t = 1, \dots, 1548$

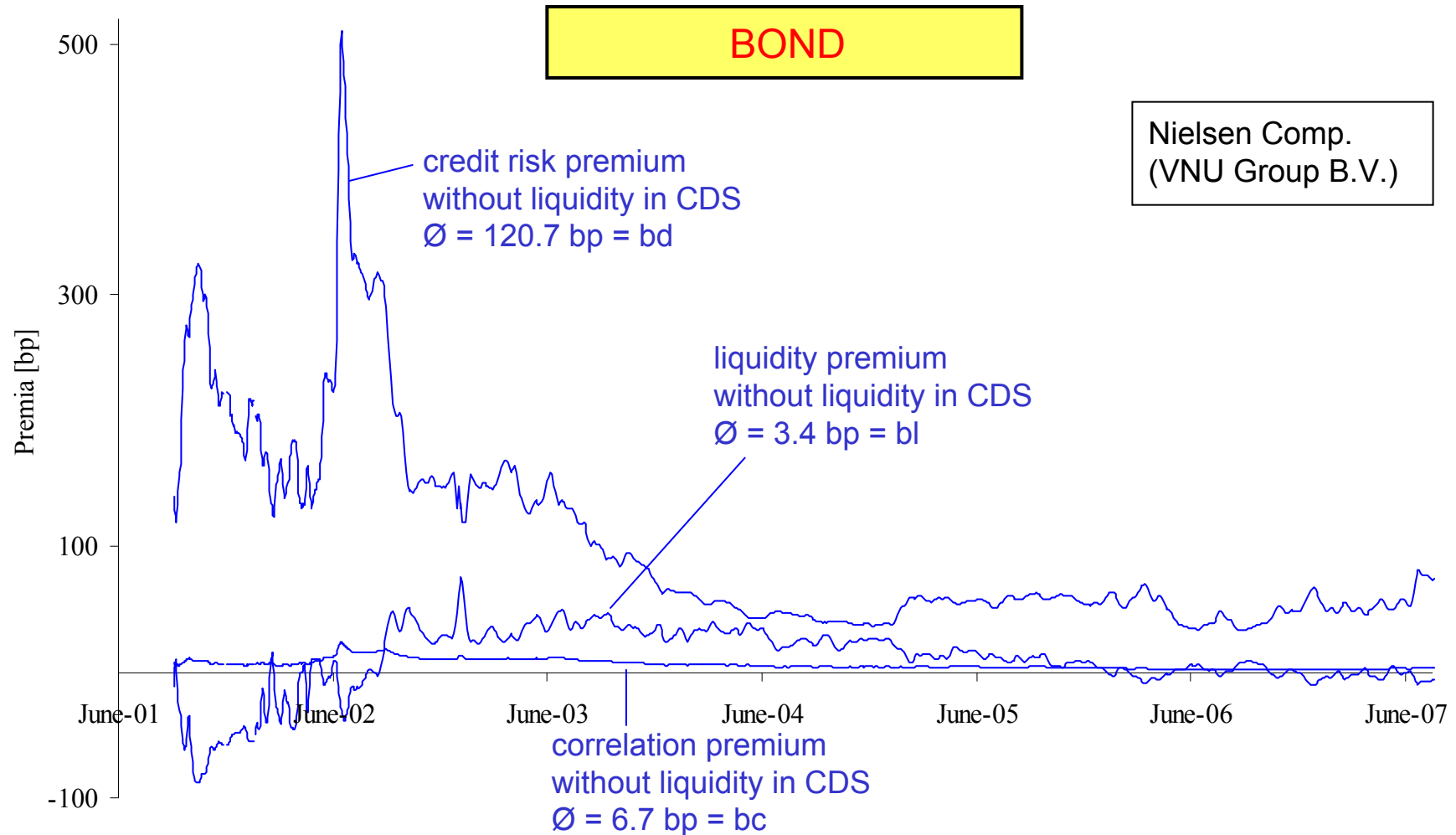
$$\min \sum_t \sum_i (P_{t,i}^{\text{theor.}}(\alpha, \dots, \eta^{c_b}) - P_{t,i}^{\text{obs.}})^2$$

Step 3: update f , g from time series $(x_t, y_t^b, y_t^{\text{ask}}, y_t^{\text{bid}})$, etc.

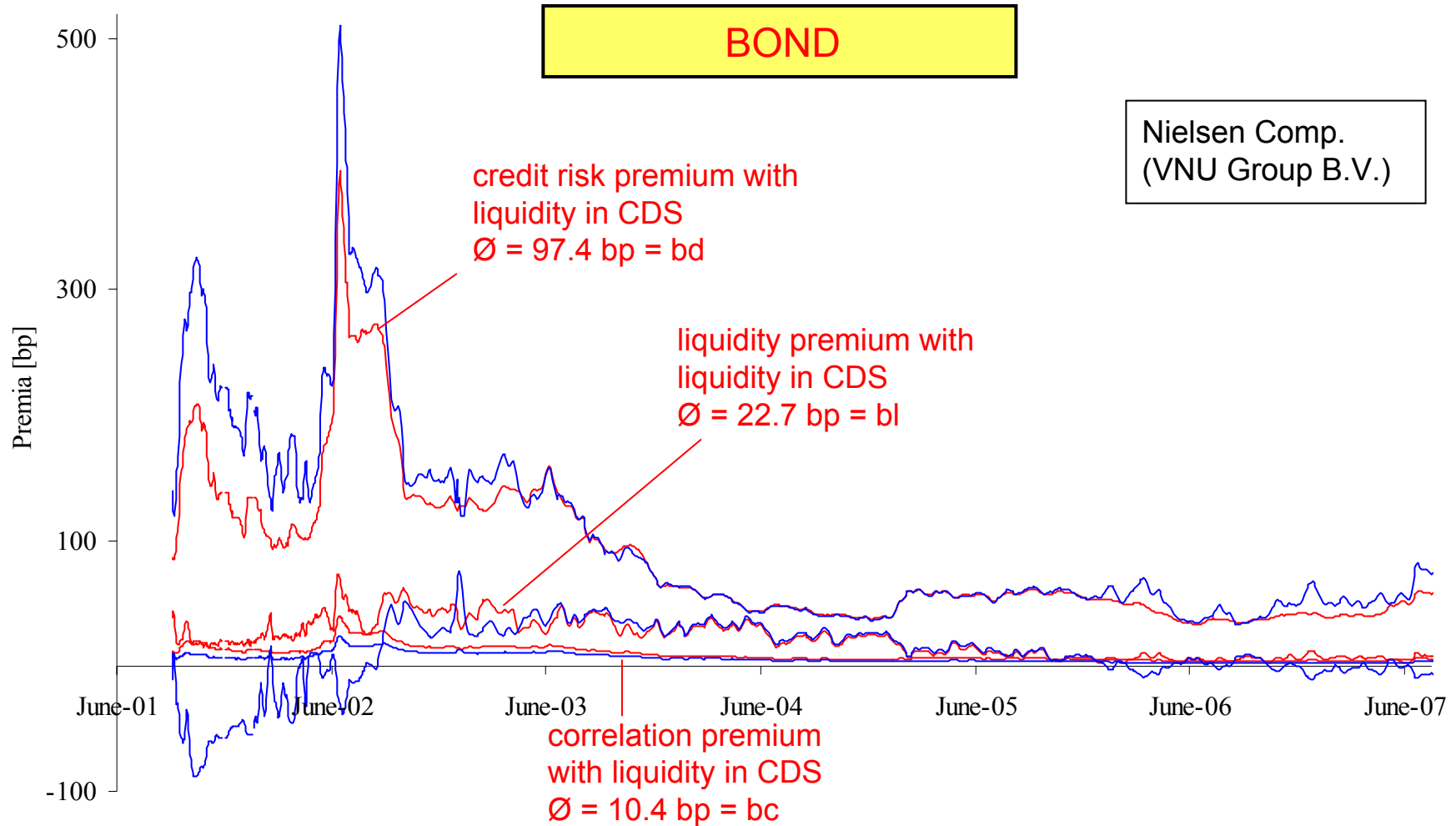
Step 4: synthetic 5 year par bond: **bd, bl, bc**

5 year CDS: **sd, sl, sc**

FIRM-SPECIFIC ANALYSIS



FIRM-SPECIFIC ANALYSIS

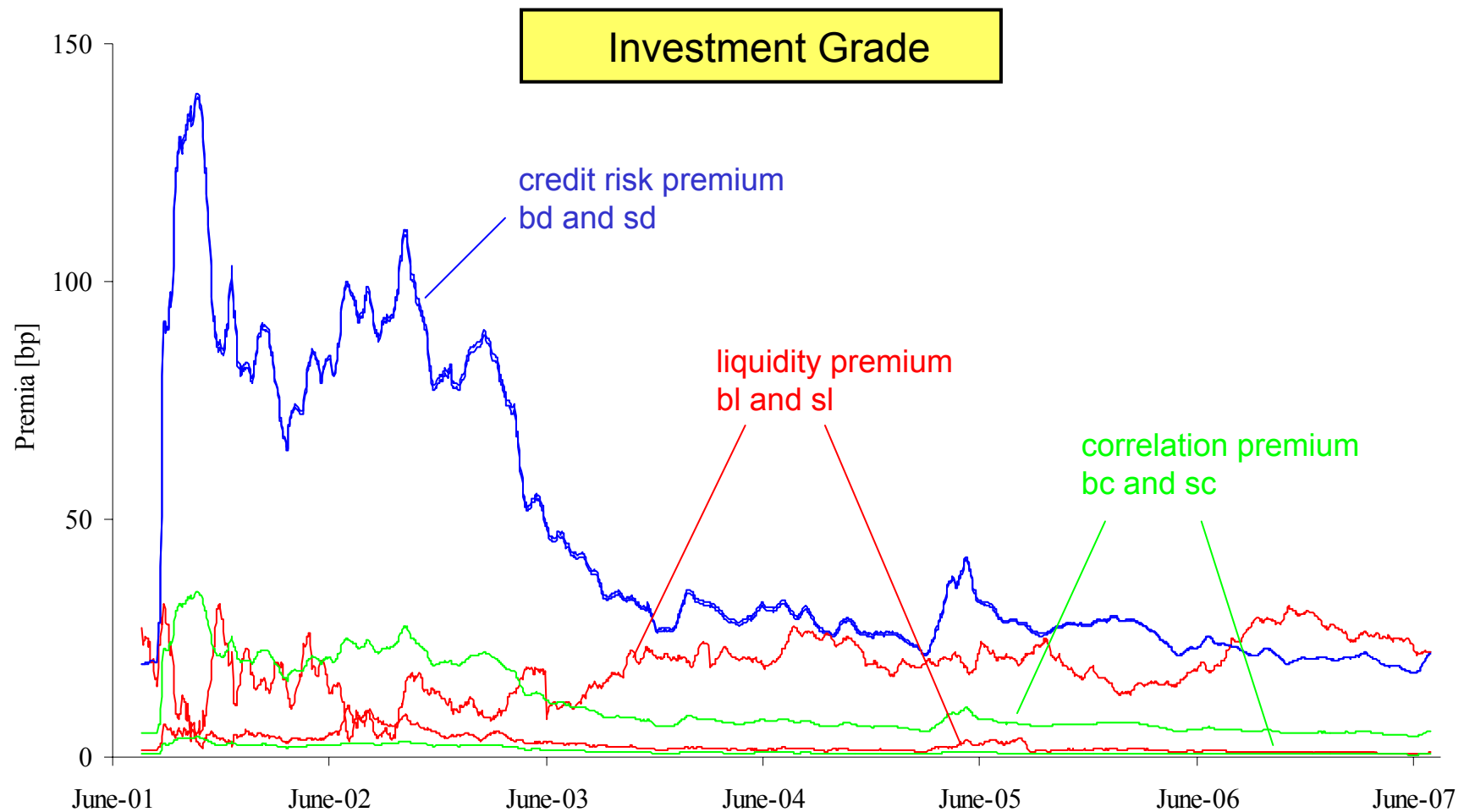


ANALYSIS BY RATING CLASS

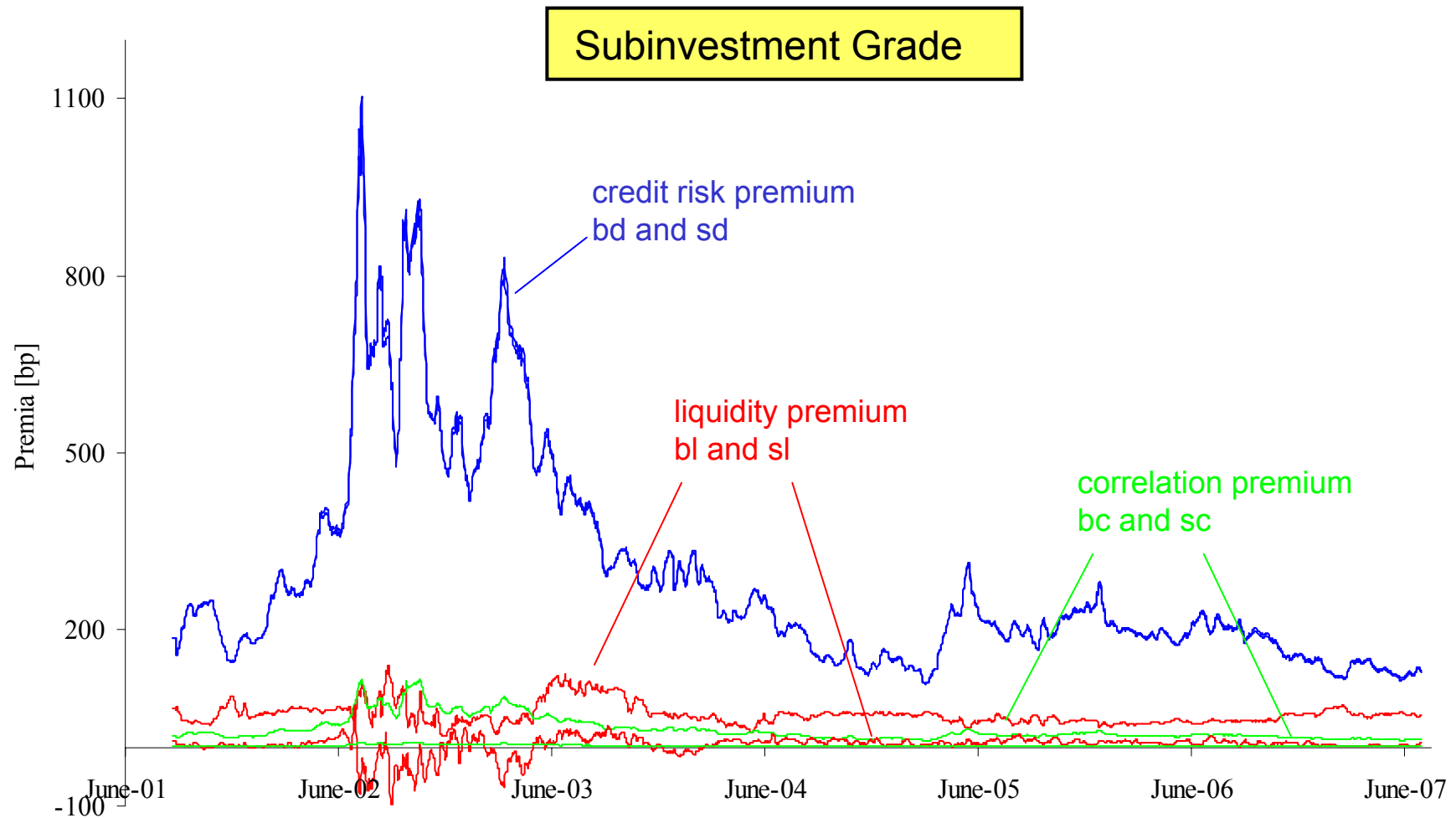
	AAA-BBB	BB-CCC	All
bd min/max	32.7 1.0 / 1,214.4	274.7 32.6 / 1,807.1	44.4
bl min/max	23.9 0.6 / 567.1	52.6 1.5 / 451.6	26.4
bc min/max	3.9 -1.3 / 251.5	17.3 0.4 / 353.5	3.6
sd min/max	33.4 4.2 / 1,281.9	278.2 34.0 / 1,948.4	44.8
sl min/max	1.9 -0.6 / 27.7	5.8 -153.8 / 194.3	1.9
sc min/max	0.3 -6.7 / 51.8	6.3 -3.2 / 98.9	0.4

V. Results

MEAN CREDIT RISK, LIQUIDITY, AND CORRELATION PREMIA



MEAN CREDIT RISK, LIQUIDITY, AND CORRELATION PREMIA



TIME SERIES ANALYSIS

Vector Autoregressive Model

IG	Credit Risk		Liquidity	
	Δbd	Δsd	Δbl	Δsl
$\Delta bond_{-1}$	-0.41	0.18	-0.45	-0.01
ΔCDS_{-1}	0.14	-0.07	-0.02	-0.53
SubIG				
$\Delta bond_{-1}$	-2.54	1.79	-0.46	-0.08
ΔCDS_{-1}	2.28	-1.51	-0.01	-0.64

- credit risk premia move **jointly**, liquidity premia **reversely**
- bond liquidity premia affect CDS liquidity premia in IG, **not** vice versa
- SubIG: slight impact of CDS liquidity, but **limited economic significance**

TIME SERIES ANALYSIS

Vector Error Correction Model

IG	Increasing Risk Phase	
	Credit Risk	Liquidity
Coint. Coef.	-1.02	68.96
ECT bond	-0.14	0.00
ECT CDS	0.07	-0.05
SubIG		
Coint. Coef	-1.02	2.90
ECT bond	-2.92	-0.07
ECT CDS	-2.46	-0.27

CONCLUSIONS

- liquidity in bond and CDS market modelled differently
- credit risk affects liquidity **but not vice versa**
- **60% credit risk**, 35% liquidity, 5% correlation in bond market
- **95% credit risk**, 4% liquidity, 1% correlation in CDS market
- CDS liquidity **matters**
- time-varying liquidity premia
Explanation : **CREDIT CHANNEL**
- **asymmetric** liquidity spill-over
- **sensitive** to market situation / rating

CORRELATION STRUCTURE

- Correlation structure between default and liquidity rates

$$\begin{pmatrix} d\lambda_t \\ d\gamma_t^b \\ d\gamma_t^{\text{ask}} \\ d\gamma_t^{\text{bid}} \end{pmatrix} = \begin{pmatrix} 1 & g_b & g_{\text{ask}} & g_{\text{bid}} \\ f_b & 1 & \omega_{b,\text{ask}} & \omega_{b,\text{bid}} \\ f_{\text{ask}} & \omega_{b,\text{ask}} & 1 & \omega_{\text{ask},\text{bid}} \\ f_{\text{bid}} & \omega_{b,\text{bid}} & \omega_{\text{ask},\text{bid}} & 1 \end{pmatrix} \begin{pmatrix} dx_t \\ dy_t^b \\ dy_t^{\text{ask}} \\ dy_t^{\text{bid}} \end{pmatrix}$$

$$= \begin{pmatrix} 1 & g_b & g_{\text{ask}} & g_{\text{bid}} \\ f_b & 1 & \omega_{b,\text{ask}} & \omega_{b,\text{bid}} \\ f_{\text{ask}} & \omega_{b,\text{ask}} & 1 & \omega_{\text{ask},\text{bid}} \\ f_{\text{bid}} & \omega_{b,\text{bid}} & \omega_{\text{ask},\text{bid}} & 1 \end{pmatrix} \left(\begin{pmatrix} \alpha - \beta x_t \\ \mu^b \\ \mu^{\text{ask}} \\ \mu^{\text{bid}} \end{pmatrix} dt + \begin{pmatrix} \sigma \sqrt{x_t} dW_{x,t} \\ \eta^b dW_{y^b,t} \\ \eta^{\text{ask}} dW_{y^{\text{ask}},t} \\ \eta^{\text{bid}} dW_{y^{\text{bid}},t} \end{pmatrix} \right)$$

II. The Model

$$\text{Corr}(d\lambda_t, d\gamma_t^b) = \frac{f_b \sigma^2 x_t + g_b \eta^{b^2} + g_{ask} \omega_{b,ask} \eta^{ask^2} + g_{bid} \omega_{b,bid} \eta^{bid^2}}{\sqrt{(\sigma^2 x_t + g_b^2 \eta^{b^2} + g_{ask}^2 \eta^{ask^2} + g_{bid}^2 \eta^{bid^2}) (f_b^2 \sigma^2 x_t + \eta^{b^2} + \omega_{b,ask}^2 \eta^{ask^2} + \omega_{b,bid}^2 \eta^{bid^2})}}$$

$$\text{Corr}(d\gamma_t^{ask}, d\gamma_t^{bid}) = \frac{f_{ask} f_{bid} \sigma^2 x_t + \omega_{b,ask} \omega_{b,bid} \eta^{b^2} + \omega_{ask,bid} \eta^{ask^2} + \omega_{ask,bid} \eta^{bid^2}}{\sqrt{(f_{ask}^2 \sigma^2 x_t + \omega_{b,ask}^2 \eta^{b^2} + \eta^{ask^2} + \omega_{ask,bid}^2 \eta^{bid^2}) (f_{bid}^2 \sigma^2 x_t + \omega_{b,bid}^2 \eta^{b^2} + \omega_{ask,bid}^2 \eta^{ask^2} + \eta^{bid^2})}}$$

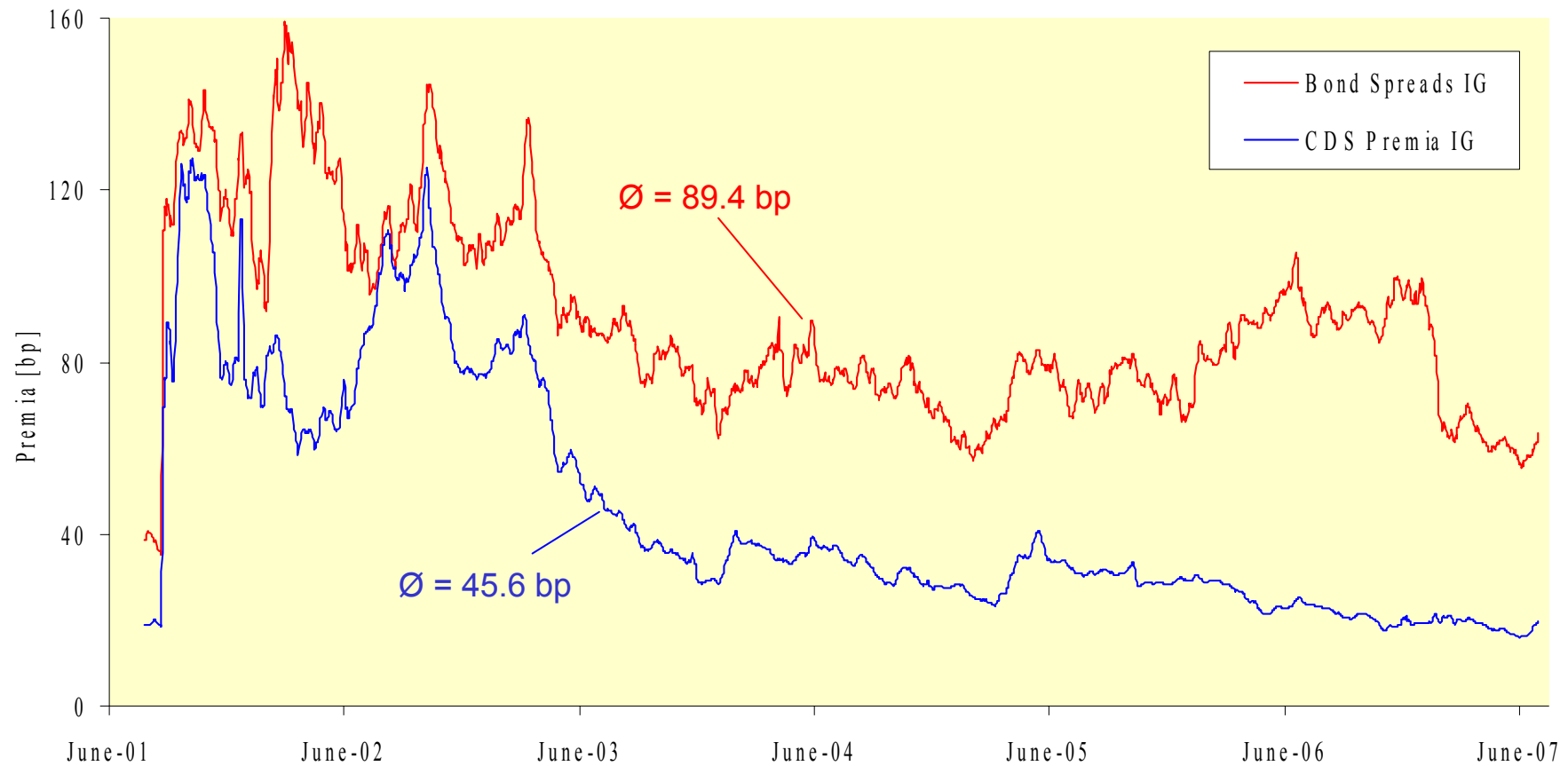
STABILITY ANALYSIS

- using CDS bid or ask quotes only

	bid and ask	ask only	bid only
bd	44.38	44.15	44.78
mean abs. diff.	-	0.48	0.55
bl	-	1.37	1.42
bc	-	0.16	0.14
sd	-	0.88	0.85
sl	-	0.87	0.85
sc	-	0.73	0.38

IV. Data and Design

Investment Grade



IV. Data and Design

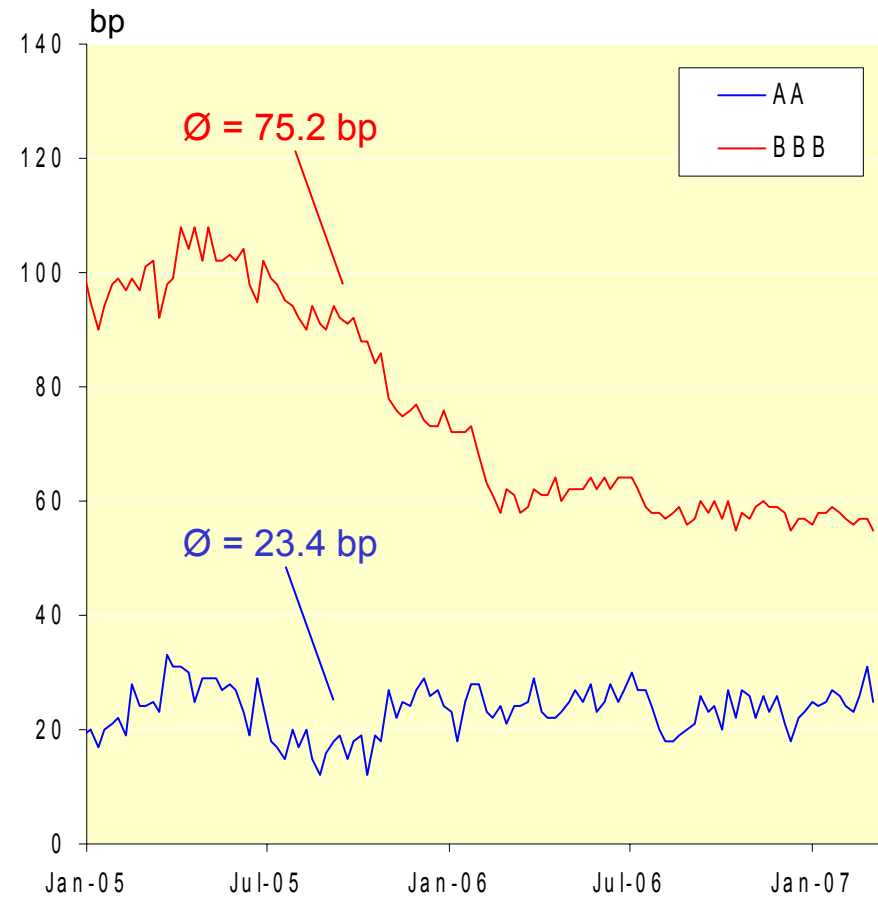
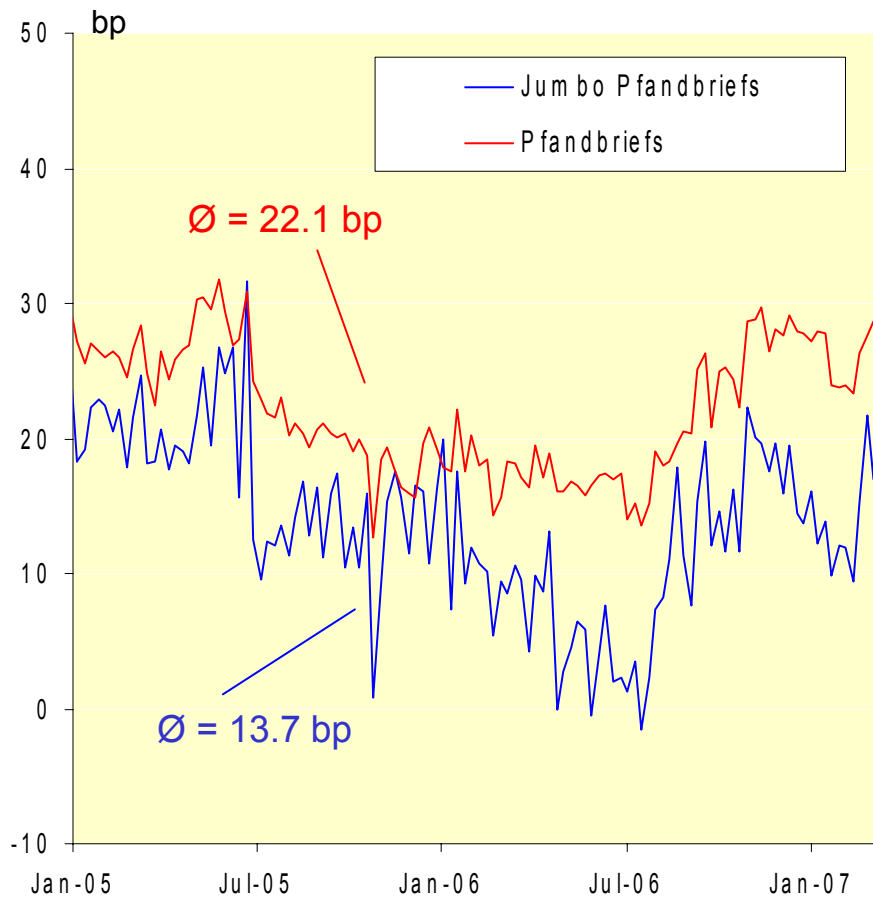
Subinvestment Grade



I. Motivation

Primarily
Liquidity Premia

Primarily
Credit-Risk Premia



I. Motivation

Literature

BOND MARKET

Elton et al. (2001); Collin-Dufresne et al. (2001); Eom et al. (2004);

Huang/Huang(2003) : 25% explained by credit risk

De Jong/Driessen (2005) : \approx 45 bp liquidity premia in **expected bond spreads**

Ericsson/Renault (2006): level of liquidity spread pos. correlated with credit risk

CDS MARKET

Tang/Yan (2006) : 4 - 17 basis points

BOND AND CDS MARKET

Aunon-Nerin et al. (2002); Houweling/Vorst (2005) : no liquidity analysis

Nashikkar/Subrahmanyam (2006) : no liquidity-risk model

Longstaff et al. (2005) : CDS perfectly liquid
but: partly negative liquidity premia

TIME SERIES ANALYSIS

Vector Autoregressive Model

$$\begin{array}{l}
 \Delta bd_i \\
 \Delta bl_i \\
 \Delta bc_i \\
 \Delta sd_i \\
 \Delta sl_i \\
 \Delta sc_i
 \end{array}
 \left. \vphantom{\begin{array}{l} \Delta bd_i \\ \Delta bl_i \\ \Delta bc_i \\ \Delta sd_i \\ \Delta sl_i \\ \Delta sc_i \end{array}} \right\} = \text{--- Level} \begin{array}{l} bd_{i-1} \\ bl_{i-1} \\ bc_{i-1} \\ sd_{i-1} \\ sl_{i-1} \\ sc_{i-1} \end{array} + \text{First differences} \begin{array}{l} \Delta bd_{i-1} \\ \Delta bl_{i-1} \\ \Delta bc_{i-1} \\ \Delta sd_{i-1} \\ \Delta sl_{i-1} \\ \Delta sc_{i-1} \end{array}$$

DATA AND EMPIRICAL DESIGN

- period 06/01 to 07/07 ; daily data
- risk-free term structure of interest rates : German Gov't Bonds
- CDS : large US investment bank (quotes, transaction prices); 5 yrs
bonds : Bloomberg (mid prices), average notch rating AAA-CCC

Step 1: parameter values $(\alpha, \beta, \sigma; \mu^b, \eta^b; \mu^{c_a}, \eta^{c_a}; \mu^{c_b}, \eta^{c_b}), f, g$

Step 2: estimation of time series $(\lambda_t; \gamma_t^b; \gamma_t^{ask}; \gamma_t^{bid})$ $t = 1, \dots, 1548$

$$\min_{(\alpha, \dots, \eta^{bid})} \sum_t \sum_i (P_{t,i}^{theor.}(\alpha, \dots, \eta^{c_b}) - P_{t,i}^{obs.})^2$$

Step 3: f, g from time series $(\lambda_t; \gamma_t^b; \gamma_t^{ask}; \gamma_t^{bid}),$ etc.

Step 4: synthetic 5 year par bond: **bd, bl, bc**

5 year CDS: **sd, sl, sc**

FIRM-SPECIFIC ANALYSIS

