

# Spillovers in the Credit Default Swap Market

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# Motivation & Background

# The CDS Contract

- The credit default swap spread is the cost per annum for a kind of protection to a “credit event”, namely a loan default
- It is tempting to praise the following argument: If an investor buys an asset which bears extra risk and simultaneously buys CDS protection this should be equivalent to purchasing a risk-free asset, hence the name CDS **spread**.
- Arbitrage tested mostly for corporate sector: Blanco et. al. (2005), Hull et. al. (2004) and may not hold

# The CDS Contract

Perfect arbitrage assumes

- Participants can *quickly* short bonds or are prepared to sell these bonds, buy riskless bonds, and sell default protection (or viceversa).
- Ignores the “cheapest-to-deliver bond” option in a credit default swap. Typically a protection seller can choose to deliver any of a number of different bonds in the event of a default to meet her obligation.
- There is counterparty risk.
- The argument assumes perfectly elastic supply of CDS contracts, whereas it is more likely that this is not the case.
- What happens in the absence of a less-risky bond alternative?

# Stylized fact # 1: Increased synchronization of CDS spread across countries

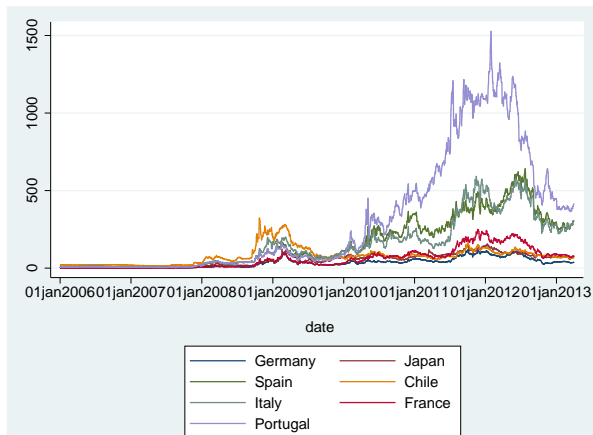


Figure : CDS by country (daily data)

# Stylized fact # 2: Bond yields do not co-move accordingly

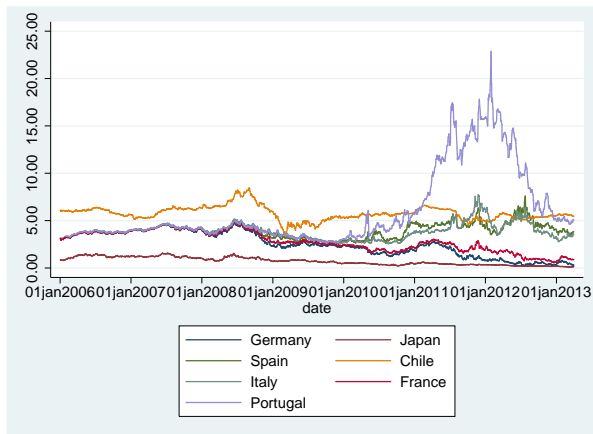


Figure : Government Bonds 5Y by country (daily data)

# What this paper is about...

- 1 Should we worry about the apparent increased synchronization of CDS spreads across countries? Does  $CDS_i$  affect  $CDS_j$ ? Can we talk about **contagion**?
- 2 If in fact we can make the case for **contagion** should we see credit spreads rising vis à vis CDS spreads?



# Pass Through: CDS to Bond Markets

# Literature Review

## A Literature on Credit Risk

1. Structural models of valuation of risk: Merton (1974), Gapen et. al. (2008)
2. Timing of default as a hazard ratio: Lando (1997)

## B Literature on no-arbitrage opportunities between CDS and bond yields

- Applications to corporate spreads: Blanco et.al. (2005), Norden and Weber (2009), Hull et.al. (2004). They all assume contemporaneous adjustment though
- I use a VAR approach to allow for non-instantaneous test of price convergence

# Bond Risk Premia vs. CDS

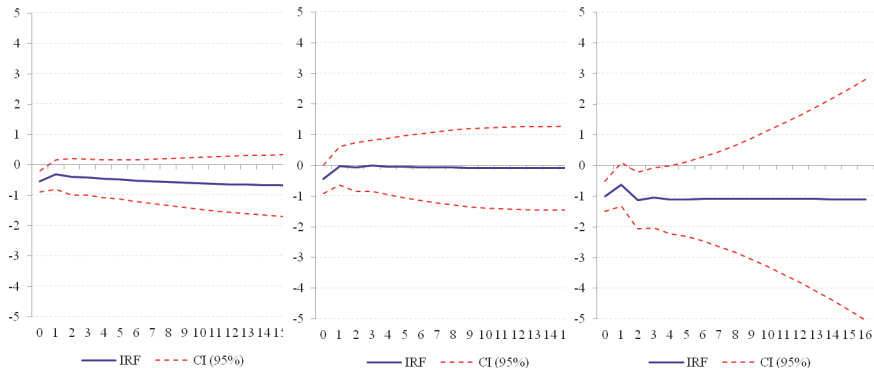
Consider the following exercise,

- Stack Bond (in Euros) yields and CDS (in %) in a VAR(p) system and calculate the Impulse Response Functions (IRF) to assess (a) size (b) average life-time (c) statistical significance of the pass-through of a shock in CDS into bond yields.
- Consider 3 time windows (for robustness)

$$\begin{bmatrix} CDS_t \\ Y_t \\ x_t \end{bmatrix} = \Phi(L) \begin{bmatrix} CDS_t \\ Y_t \\ x_t \end{bmatrix} + \begin{bmatrix} \varepsilon_t^{CDS} \\ \varepsilon_t^Y \\ \varepsilon_t^X \end{bmatrix} \quad (1)$$

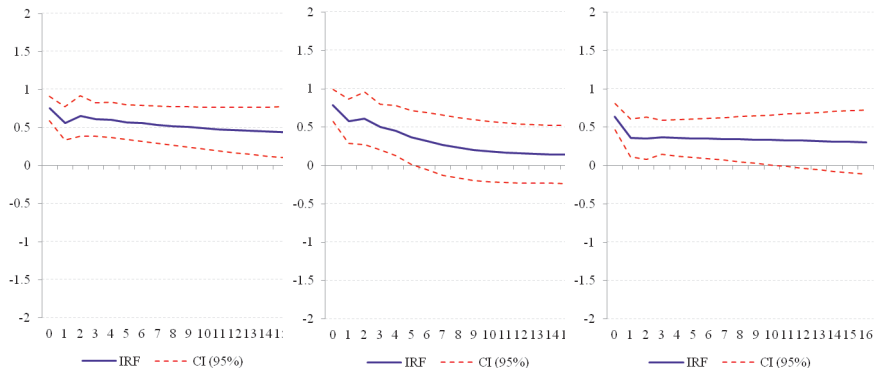
# Bond Risk Premia vs. CDS: Germany

Figure : IRF function, response of bond yields to shock in CDS in Germany



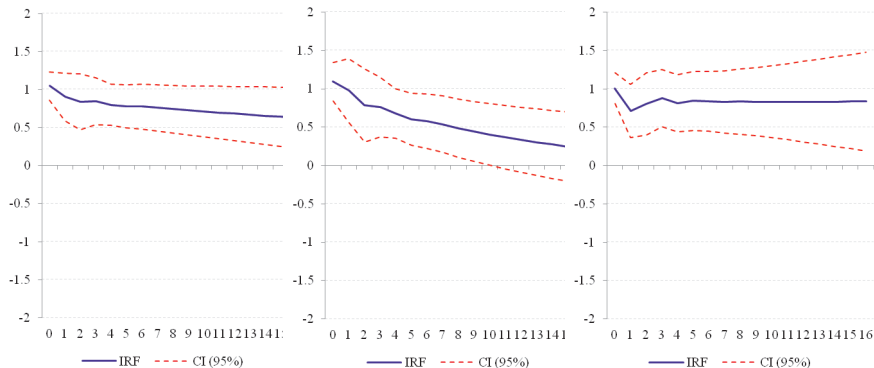
# Bond Risk Premia vs. CDS: Spain

Figure : IRF function, response of bond yields to shock in CDS in Spain



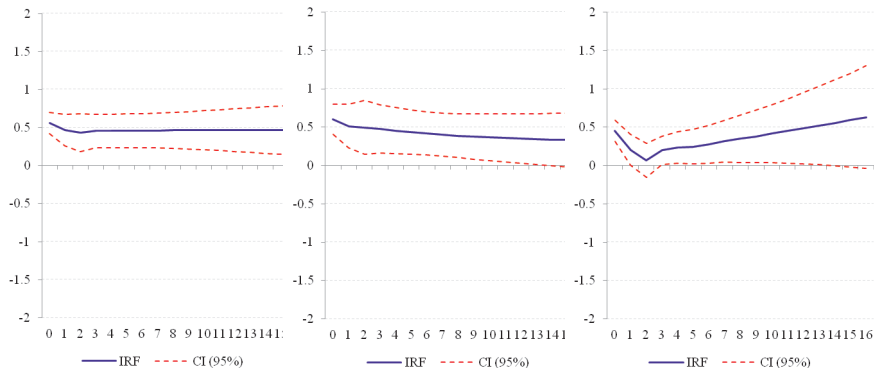
# Bond Risk Premia vs. CDS: Portugal

Figure : IRF function, response of bond yields to shock in CDS in Portugal



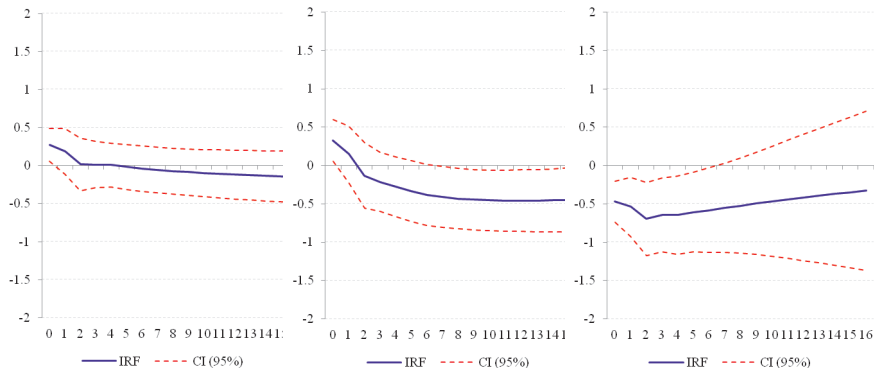
# Bond Risk Premia vs. CDS: Italy

Figure : IRF function, response of bond yields to shock in CDS in Italy



# Bond Risk Premia vs. CDS: France

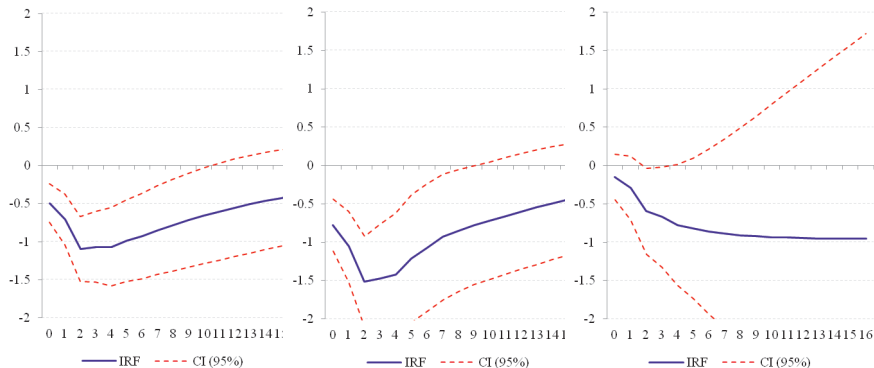
Figure : IRF function, response of bond yields to shock in CDS in France





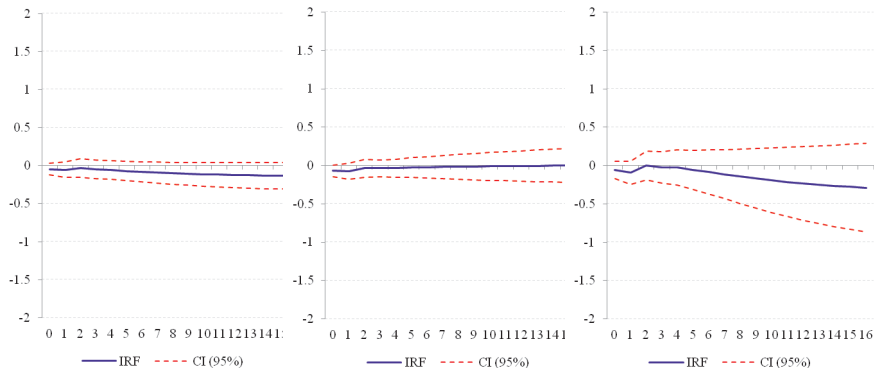
# Bond Risk Premia vs. CDS: Chile

Figure : IRF function, response of bond yields to shock in CDS in Chile



# Bond Risk Premia vs. CDS: Portugal

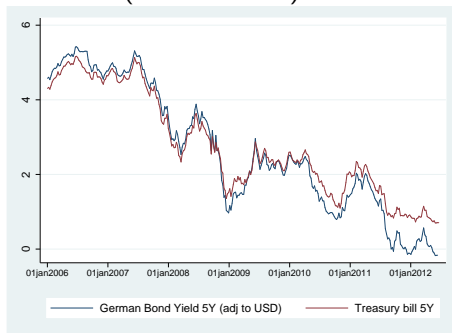
Figure : IRF function, response of bond yields to shock in CDS in Japan



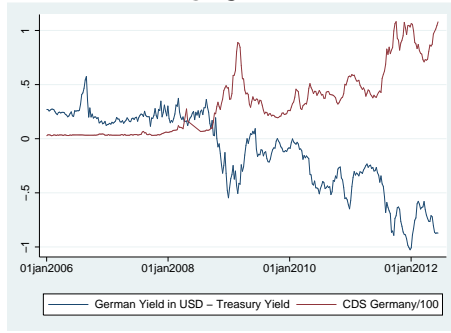
## Interpretation: Risk Premia for Germany vs. CDS

The negative correlation of the German Bond yield & its associated CDS, together with assuming the supply for CDS contracts is sort of inelastic, *hints* to a demand-led escalation of CDS spreads together with rising demand for risk-free assets (flight to quality)

(a) Germany and USA yields  
(both in USD)



(b) Risk Premia for Germany vs.  
CDS



# Contagion

# Literature Review

## C Literature on Contagion: Three main reasons

1. Correlated information or Price discovery channel: Dornbusch et. al (2002), Kiyotaki and Moore (2002), Longstaff (2010)
2. Liquidity channel: Cross regional deposits model of Allen and Gale (2000), Krodes and Pritsker (2002) and the funding-problem model of Brunnermeir and Pedersen (2009)
3. Risk aversion channel: Vayanos (2004) and Acharaya and Pedersen (2005)

# Stylized fact # 1: Increased synchronization of CDS spread across countries

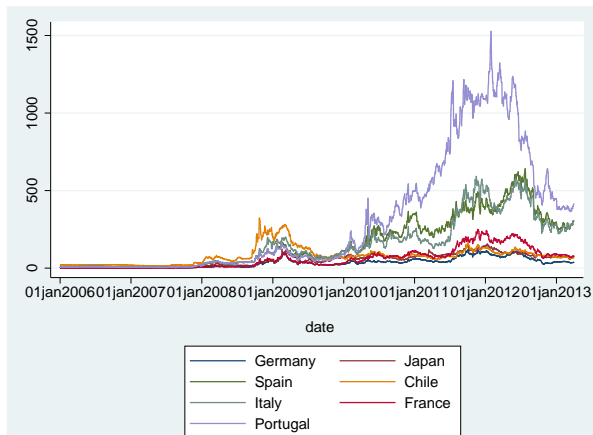


Figure : CDS by country (daily data)

## Closer look at synchronization

Take cross correlations of Germany CDS spread and other countries

**Table :** Pairwise correlations for Germany's and other countries' CDS: Weekly data

	2006-2007	2008-2009	2010	2011	2012
Portugal	0.44	0.90	0.63	0.79	<i>-0.12</i>
Spain	0.52	0.89	0.72	0.90	<i>0.51</i>
France	0.38	0.98	0.76	0.98	0.83
Italy	0.35	0.91	0.70	0.96	0.90
Japan	0.36	0.81	<i>0.33</i>	0.90	<i>0.30</i>
Chile	0.43	0.82	0.48	0.96	0.89

**Source:** Author's calculations on Bloomberg data.

**Note:** All non-italic pair-wise correlations are significant to the 1% level, using the Bonferroni-adjusted significance level.

# Mechanics of the Diebold-Yilmaz (2010) Index

- General idea: Stack CDS spreads for the seven economies (and other  $x_t$ ) in a VAR(p), and rescue the fraction of **forecast error variance** that can be attributed to other countries. This is a standard measure of contagion once we have accounted for feedback in crossed dynamics
- Intuition: The larger the error in predicting variable  $x$  that can be accounted for by *other* errors, then the larger the contagion
- Consider this exercise also for volatility of the series



# Contagion Index

Consider the simple first order two-variable VAR

$$\mathbf{x}_t = \Phi \mathbf{x}_{t-1} + \varepsilon_t \quad (2)$$

where  $\mathbf{x}_t = (x_{1,t}, x_{2,t})$  and  $\Phi$  is a  $2 \times 2$  parameter matrix. Then covariance stationarity implies

$$\mathbf{x}_t = \Theta(L)\varepsilon_t$$

where  $\Theta(L) = (I - \Phi L)^{-1}$ . It can also be written as,

$$\mathbf{x}_t = A(L)\mathbf{u}_t \quad (3)$$

with  $A(L) = \Theta(L)Q_t^{-1}$ ,  $\mathbf{u}_t = Q_t\varepsilon_t$ ,  $E(\mathbf{u}_t\mathbf{u}_t') = I$  and  $Q_t^{-1}$  is the unique lower triangular Cholesky factor of the covariance matrix of  $\varepsilon_t$

# Contagion Index

- Then the one-step ahead error is

$$\mathbf{e}_{t+1,t} = \mathbf{x}_{t+1} - E(\mathbf{x}_{t+1} | \mathbf{x}_t \dots \mathbf{x}_1) = \mathbf{A}_0 \mathbf{u}_{t+1} = \begin{bmatrix} \alpha_{0,11} & \alpha_{0,12} \\ \alpha_{0,21} & \alpha_{0,22} \end{bmatrix} \begin{bmatrix} u_{1,t+1} \\ u_{2,t+1} \end{bmatrix}$$

which has covariance matrix  $E(\mathbf{e}_{t+1,t} \mathbf{e}'_{t+1,t}) = \mathbf{A}_0 \mathbf{A}'_0$ , since  $E(\mathbf{u}_t \mathbf{u}'_t) = I_k$ , with  $k = \#$  of countries. If we were considering a one-step-ahead error in forecasting  $\mathbf{x}_{1,t}$ , its variance would be  $\alpha_{0,11}^2 + \alpha_{0,12}^2$ .

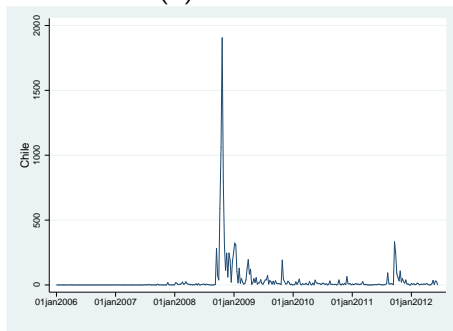
- The relative contribution to the FEVD for  $x_1$  from  $x_2$  is  $\hat{\alpha}_{0,12}^2 = [\alpha_{0,12}^2 / (\alpha_{0,11}^2 + \alpha_{0,12}^2)]$  with (conveniently)  $\hat{\alpha}_{0,12}^2 \in [0, 1]$ .

# The Data: Calculating intra-week Volatility

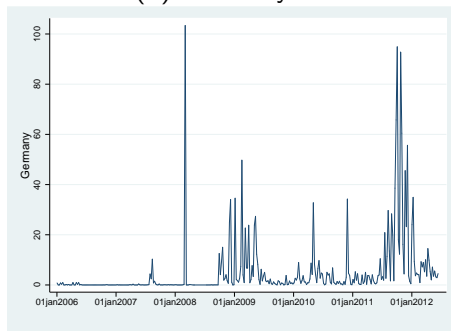
Use Garman and Klass (1980) measure of weekly volatility

$$\sigma_{it}^2 = 0.511(H_{it} - L_{it})^2 - 0.383(C_{it} - O_{it})^2 - 0.019[(C_{it} - O_{it})(H_{it} + L_{it} - 2O_{it}) - 2(H_{it} - O_{it})(L_{it} - O_{it})] \quad (4)$$

(a) Chile



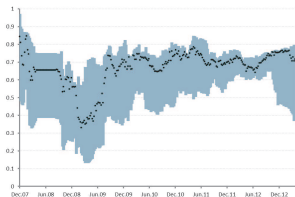
(b) Germany



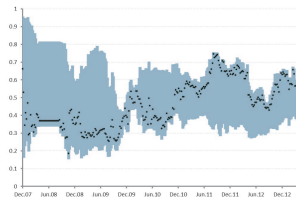
# Contagion Index for returns on CDS

Index based on Diebold and Yilmaz (2010)

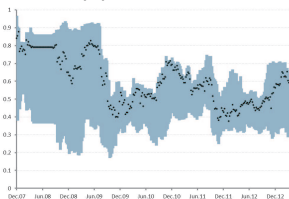
(a) Germany



(b) Chile

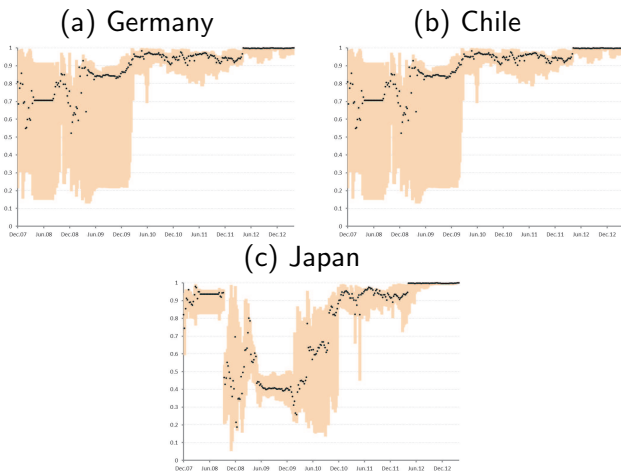


(c) Japan



# Contagion Index for returns on CDS

Index based on Diebold and Yilmaz (2010)



# Conclusions

- I examine the relation of credit spreads in sovereign debt with CDS spreads in a 16 week horizon
- There exist two groups of countries
  - i) CDS shocks affect bonds yields positively: pass-through
  - ii) Safe-havens, in which effect is negligible or negative
- Possible to estimate an index of contagion in a weekly basis: No evidence for contagion in levels from troubled economies to safe-havens in 2012. Not possible to say the same regarding volatility.