A Dynamic Yield Curve Model with Stochastic Volatility and Non-Gaussian Interactions: An Empirical Study of Non-Standard Monetary Policy in the Euro Area

by G. Mesters, B. Schwaab and S.J. Koopman

Discussion:

Jean-Paul Renne, Banque de France

The views presented here are not necessarily those of the Banque de France.

### Overview

- Study of the yield curve and its interactions with measures of non-standard monetary-policy.
- (Separate) Modeling of German, French, Italian and Spanish yield curves.
- Various non-Gaussian features.
- Estimation based on importance sampling techniques.
- Results:
  - SMP had a direct and temporary effect on yield curves (10 weeks),
  - Limited evidence that purchases changed the relationship between EONIA and the yield curve.
  - During crisis, response of the yield curve to EONIA was different (impaired) in some countries.

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• Yield curves have Nelson-Siegel parametric form:

$$y_{\tau,t} = \underbrace{\beta_{1,t}}_{level} + \underbrace{\beta_{2,t}}_{slope} \left( \frac{1 - e^{-\lambda \tau}}{\lambda \tau} \right) + \underbrace{\epsilon_{\tau,t}}_{measur.error}.$$
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- The x<sub>i,t</sub>s are monetary-policy-related explanatory variables. Their conditional distributions depend on factors θ<sub>i,t</sub>s whose dynamics interact with the β<sub>i,t</sub>s.
- The state vector is  $\alpha_t = (\beta_{1,t}, \beta_{2,t}, \theta_{1,t}, \theta_{2,t})'$ . It follows a Gaussian VAR:

$$\alpha_t - \mu = H(\alpha_{t-1} - \mu) + \xi_t, \qquad \xi_t \sim \mathcal{N}(0, Q).$$
(2)

•  $x_{1,t}$  is the EONIA rate.

Conditionally on  $\alpha_t$ , the log of the EONIA is Gaussian:

$$\log(x_{1,t})|\theta_t \sim \mathcal{N}(\theta_{1,t},\sigma^2).$$

•  $x_{2,t}$  are the the SMP-purchased amounts.

Conditionally on  $\alpha_t$ , the amounts purchased are Poisson-distributed with intensity  $\exp(\theta_{2,t})$ :

$$\log(x_{1,t})|\theta_t \sim \mathcal{P}(\exp(\theta_{2,t})).$$

• Conditionally on  $\alpha_t$ , the  $x_{i,t}$ s are independent from all other factors.

### Comments 1 Arbitrage Opportunities

- Over the last decade, the bulk of interest-rate term-structure (TS) studies relies on the theoretically-appealing no-arbitrage framework.
- This paper does not follow this strand of literature. In particular, this prevents the authors from studying the influence of agents' aversion to interest-rate risks on yields (= computation of term premia).

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Arbitrage Opportunities

- Over the last decade, the bulk of interest-rate term-structure (TS) studies relies on the theoretically-appealing no-arbitrage framework.
- This paper does not follow this strand of literature. In particular, this prevents the authors from studying the influence of agents' aversion to interest-rate risks on yields (= computation of term premia).
- However, important advantage of the present framework: less constraints on the dynamics.
  - ► To remain tractable, no-arbitrage TS models have to involve "affine" processes (such that E<sub>t</sub>(exp(-z<sub>t+1</sub> ··· z<sub>t+h</sub>)) = exp(A<sub>h</sub> + B<sub>h</sub>z<sub>t</sub>)).
  - Then, why using a simple (single-lag) Gaussian VAR for  $\alpha_t$ ?
  - ▶ In particular, easy to design a ZLB-consistent dynamics where  $\beta_{1,t} + \beta_{2,t}$  (shortest-term rate) and  $\beta_{1,t}$  (rate of maturity  $\infty$ ) are > 0.
- $\Rightarrow$  This "advantage" is somewhat underexploited here.

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# Comments 2

The estimation

- Maximization of likelihood whose computation is based on an importance sampling approach; computationally intensive.
- Advantages of the method should be highlighted/demonstrated.
- Far less sophisticated/complicated approach can be designed to quickly estimate the model.

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- Maximization of likelihood whose computation is based on an importance sampling approach; computationally intensive.
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- Far less sophisticated/complicated approach can be designed to quickly estimate the model.
- For instance, recall that ( $\Lambda$  = Nelson-Siegel factor loadings):

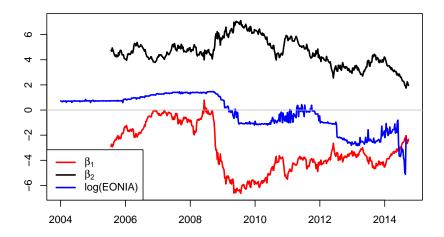
$$\underbrace{Y_t}_{(N\times 1)} = \underbrace{\Lambda'}_{(N\times 2)} \underbrace{\beta_t}_{(2\times 1)} + \epsilon_t,$$

 $\Rightarrow$  Immediate estimates of  $\beta_t$  can be obtained by regressing  $Y_t$  on  $\Lambda$  (Renne, 2012):

$$\underbrace{\hat{\beta}}_{(T\times 2)} = ((\Lambda\Lambda')^{-1}\Lambda\underbrace{Y}_{(N\times T)})'.$$

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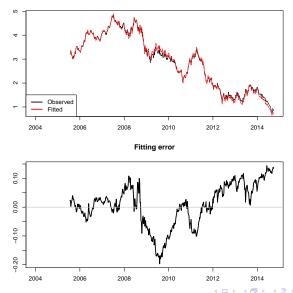
### Quick $\hat{\beta}s$



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#### Persistence in fitting errors (not addressed by the model)



Observed versus fitted 10-year yield

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# Comment 3

About the use of the EONIA

- (a) While it is also a yield (au 
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  - Up to the (assumed i.i.d.) measurement errors, the model reckons that yields are (marginally and conditionally) Gaussian whereas EONIA is lognormal.
  - ► The (mean) log of the EONIA enters the VAR ⇒ a cut in the policy rate is expected to have a stronger impact on yields in low-yield environment.

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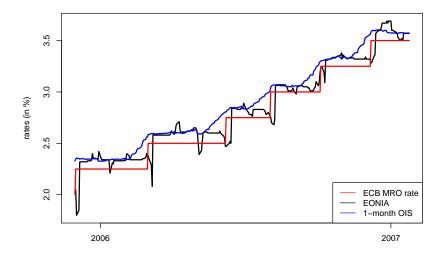
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  - ► The (mean) log of the EONIA enters the VAR ⇒ a cut in the policy rate is expected to have a stronger impact on yields in low-yield environment.
- (b) The EONIA is used as a proxy of the monetary-policy stance. However, the EONIA is a lagged proxy of the monetary-policy stance:
  - Interest-rate decisions (MRO, Deposit facility, Lending facility) are taken on Thursdays.
  - The EONIA tends to be affected on the next Tuesday (first day on which new MROs are operated).

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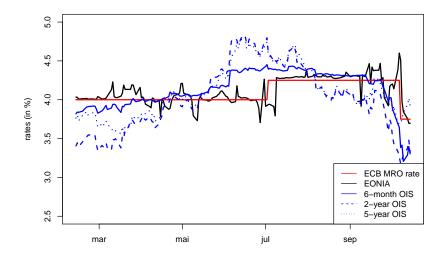
#### The EONIA is a lagged proxy of monetary-policy stance



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The EONIA does not react contemporaneously to key MP announcements

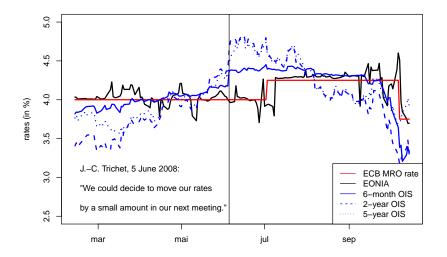


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#### Table: Regressing yields on EONIA

Dependent variable:			
rate_2yrs		rate_10yrs	
(1)	(2)	(3)	(4)
1.010 <sup>***</sup> (0.010)	0.999*** (0.003)	0.991 <sup>***</sup> (0.008)	1.000 <sup>***</sup> (0.004)
-0.012 (0.010)		0.007 (0.006)	
	0.039 (0.025)		-0.007 (0.026)
561	561	479	479
0.996	0.996	0.993	0.993
0.996	0.996	0.993	0.993
	(1) 1.010*** (0.010) -0.012 (0.010) 561 0.996	rate_2yrs           (1)         (2)           1.010***         0.999***           (0.010)         (0.003)           -0.012         0.039           (0.025)         561           561         561           0.996         0.996	rate_2yrs         rate_(1)         (2)         (3)           1.010***         0.999***         0.991***         (0.008)           -0.012         0.007         (0.006)           0.039         (0.025)         0.099           561         561         479           0.996         0.996         0.993

p<0.1; ‴ p<0.05; p<0.01

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Dependent variable:			
rate_2yrs		rate_10yrs	
(1)	(2)	(3)	(4)
1.018 <sup>***</sup> (0.009)	0.999 <sup>***</sup> (0.003)	0.992 <sup>***</sup> (0.009)	0.999 <sup>***</sup> (0.004)
-0.023 <sup>**</sup> (0.010)		0.007 (0.007)	
	0.158*** (0.056)		0.155*** (0.057)
561	561	479	479
0.996	0.996	0.993	0.993
0.996	0.996	0.993	0.993
	(1) 1.018*** (0.009) -0.023** (0.010) 561 0.996	rate_2yrs           (1)         (2)           1.018***         0.999***           (0.009)         (0.003)           -0.023**         (0.010)           0.158***         (0.056)           561         561           0.996         0.996	rate_2yrs         rate_(1)         (2)         (3)           1.018***         0.999***         0.992***         (0.009)           (0.009)         (0.003)         (0.009)           -0.023**         0.007         (0.007)           0.158***         (0.056)         561           561         561         479           0.996         0.996         0.993

#### Table: Regressing yields on MRO (policy rate)

p<0.05; p<0.01

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### Comment 3 About the use of the EONIA

- EONIA should be replaced with more appropriate measures of monetary-policy surprises.
- $\Delta(MRO)_t$  (used in previous slides) is only a rough measure.
- See Kuttner (2001) or Piazzesi & Swanson (2008) for market-based measures of monetary-policy surprises:

e.g.: Changes in OIS prices around ECB announcements events reflect unanticipated changes in future policy rates (Jardet and Monks, 2014).

• The distribution of these shocks is far from Gaussian. The model/estimation method could be appropriately exploited to handle that.

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## Conclusion

- Nicely-written, interesting and stimulating paper.
- The SMP analysis is too short; bond-purchase factors show up at the very end of the paper.
- The study of the impact of ECB stance on yield curve could be improved.
- The fact that authors do not have to care about affine-related constraints could & should be better exploited.
- Looking forward to reading future version.

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Thank you!