

Modelling yields at the lower bound through regime shifts¹

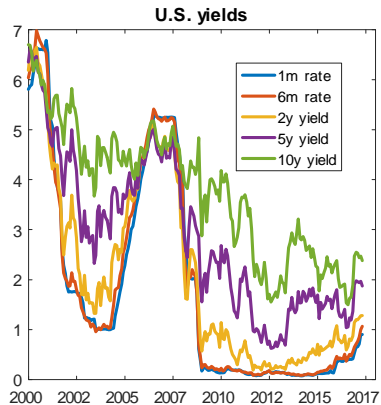
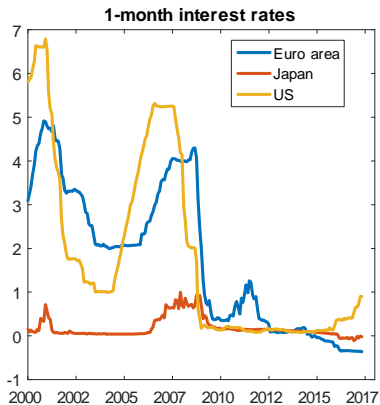
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ABFER 2017

23 May 2017

¹The views expressed do not necessarily reflect those of the BIS or the ECB.

Short-term interest rates and U.S. yields



- Lessons from recent effective lower bound (ELB) experiences
 - ELB is not zero, due to cash storage costs; its exact level is uncertain
 - ELB spells can be extremely persistent; and expected to be persistent
 - US experience suggests very slow pace of normalisation after exiting ELB
- Shadow rate models (e.g. Bauer&Rudebusch 2015; Wu&Xia 2016) empirically successful (and parsimonious), but:
 - they impose a hard constraint, arguably too strong an assumption
 - the state vector dynamics are the same at the ELB as in normal times
 - this suggests fast pace of normalisation after exiting ELB

Modelling yields at the ELB

- We study an alternative model of yields at the ELB. Two regimes: Normal (N) and Lower bound (L), with stochastic switches
 - allows for different dynamics conditional on regime
- Regime-switching probabilities are state dependent: the probability of switching to L is high when the policy rate is close to 0; the prob. of switching to N increases as the short rate rises
- Benefit: explicit account of state nonlinearity at the ELB; allows ELB episodes to be very persistent; bond prices reflect these features – also after exiting
- Cost: more parameters \rightarrow use solely observable state variables

Results (so far)

- Application to US term structure using yield factors
- Good fit; clear identification of regimes
- The RS model rules out a deeply negative policy rate (but allows it to dip below the estimated LB)
- The model implies a slow pace of policy rate normalisation in coming years
- Compared to an affine model: higher term premia in recent years / lower average expected policy rates
- Regime shift risk is priced by investors, but magnitude is small

Regime-switching model

- State vector

$$x_{t+1} = \mu^j + \Phi^j x_t + \Sigma^j \varepsilon_{t+1}$$

with $j = N, L$ and $x_t = [c_t \quad s_t \quad r_t]'$; i.e. curvature, slope, r .

- By assumption, under L the policy rate:
 - is expected to remain constant;
 - does not affect the other factors

$$r_{t+1} = \mu_r^L + \sigma^L \varepsilon_{r,t+1},$$
$$\Phi^L = \begin{bmatrix} \phi_{CC}^L & \phi_{CS}^L & 0 \\ \phi_{SC}^L & \phi_{SS}^L & 0 \\ 0 & 0 & 0 \end{bmatrix}.$$

Regime-switching model

- RS probabilities are state-dependent:
 - general intuition: the lower r , the more likely a switch to L ; the higher r , the more likely a switch to N .
- Specifically:

$$\pi_t^{\mathbb{P},NL} = \int^{\theta_r} \frac{1}{\sigma_r^N \sqrt{(2\pi)^2}} \exp\left(-\frac{1}{2} \left(\frac{r - \mu_{t+1}^{N,r}}{\sigma_r^N}\right)^2\right) dr.$$

and $\pi_t^{\mathbb{P},LN} = 1 - \pi_t^{\mathbb{P},NL}$.

- Assume constant Q-RS probabilities, $\pi^{\mathbb{Q},NL}$ and $\pi^{\mathbb{Q},LN}$.

Adding yields

- Pricing according to Dai, Singleton and Yang (2007) and Bansal and Zhou (2002)
- Recall state vector

$$x_{t+1} = \mu^j + \Phi^j x_t + \Sigma^j \varepsilon_{t+1}$$

- Risk-aversion induces

$$x_{t+1} = \mu^{Qj} + \Phi^{Qj} x_t + \Sigma^j \varepsilon_{t+1}$$

and, using a conditionally log-normal approximation

$$y_{t,n} = \frac{A_n^j}{n} + \frac{B_n^j}{n} x_t$$

where

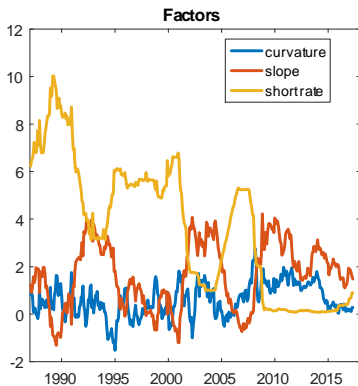
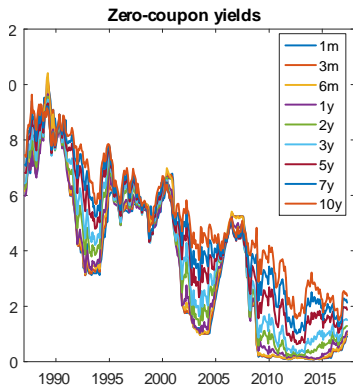
$$A_n^j = \sum_{k=1}^S \pi^{Qjk} \left(\delta_0^j + A_{n-1}^k + B_{n-1}^k \mu^{Qj} - \frac{1}{2} B_{n-1}^k \Sigma^j \Sigma^j \left(B_{n-1}^k \right)' \right)$$

$$B_n^j = \sum_{k=1}^S \pi^{Qjk} \left(\delta_x^j + B_{n-1}^k \Phi^{Qj} \right)$$

Pricing consistency

- Recall $x_t = [c_t \quad s_t \quad r_t]'$. We set $c_t = r_t + y_{t,120} - 2y_{t,36}$ and $s_t = y_{t,120} - r_t$.
- Hence $y_{t,120} = s_t + r_t$ and $y_{t,36} = \frac{1}{2}(s_t - c_t) + r_t$.
- Need to ensure consistency with $y_{t,120} = \frac{1}{120}(A_{120}^j + B_{120}^j x_t)$, so that
 - $A_{120}^j = 0$ and $B_{120}^j = [0 \quad 120 \quad 120]$
- and $y_{t,36} = \frac{1}{36}(A_{36}^j + B_{36}^j x_t)$ so that
 - $A_{36}^j = 0$ and $B_{36}^j = [-18 \quad 18 \quad 36]$
- This induces nonlinear constraints on two rows of μ^{Qj} and Φ^{Qj} .
- We impose these constraints in ML estimation.

- Monthly US yield data (end-month), January 1987 – April 2017.
- Zero-coupon yields from Fed Board (Gürkaynak, Sack, Wright, 2006)
- 1m, 3y, 10y yields used for factors; not included among yields



- We have a large number of parameters, so we need to impose some restrictions.
- We estimate the N parameters on a sub-sample when the economy clearly was in the N regime (1987 – 2007).
- We estimate the VAR L parameters under \mathbb{P} on the Dec. 2008 – Oct. 2015 sample.
- We set the short rate threshold θ_r used in $\pi_t^{\mathbb{P},NL}$ to the 10th percentile of the distribution of r .
- Remaining parameters are estimated using maximum likelihood.

Results

- Mean levels of state variables

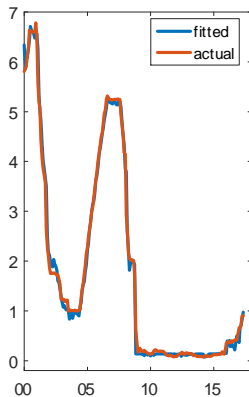
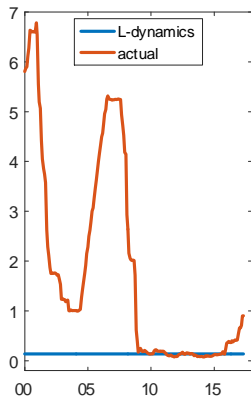
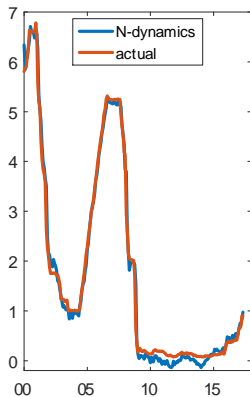
Conditional means

	N	L
c	0.473	0.962
s	1.581	2.361
r	3.286	0.136

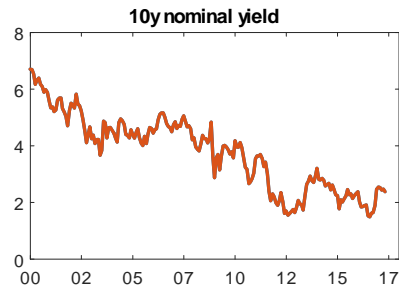
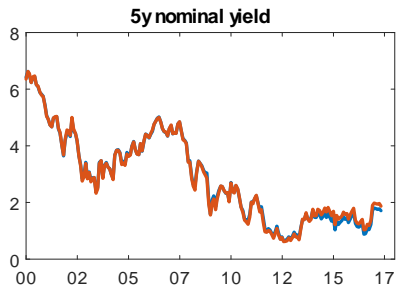
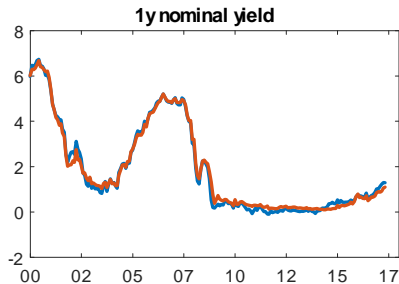
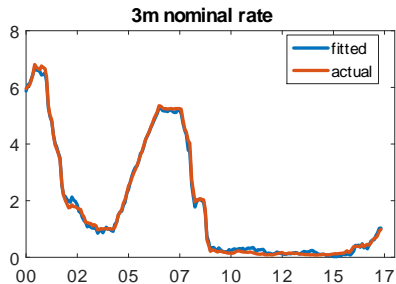
- The lower bound is estimated at 13.6 basis points.
- The steady state short rate in the normal regime is 3.29%.
- Standard deviation of yield measurement errors is $\sigma^m = 0.124$.

Short-term interest rate (zoom in on period 2000 -)

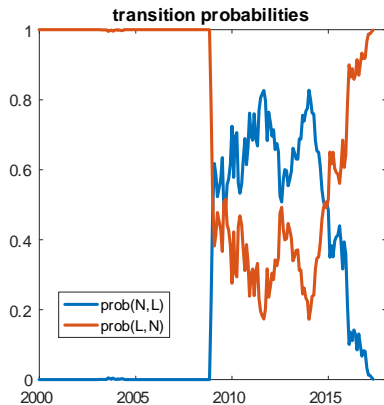
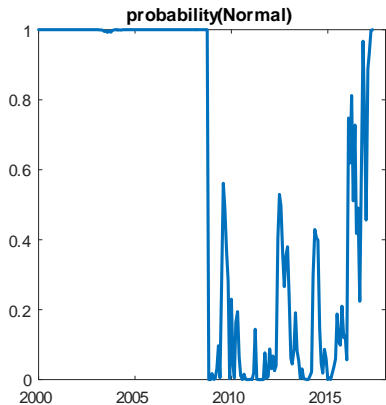
- The RS model effectively combines the N and L dynamics to ensure consistency with actual data.



Yield fit



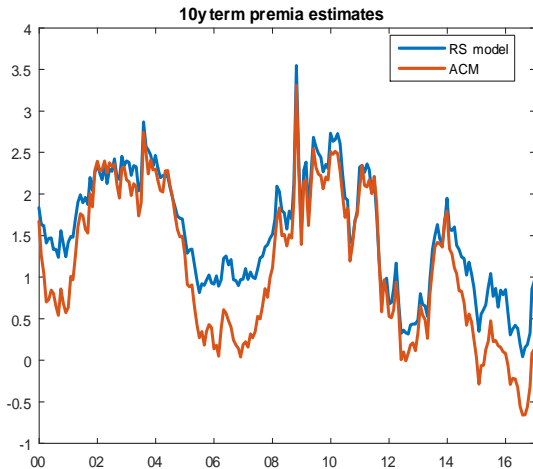
Filtered probabilities of N/L regimes



Risk premia

Term premium

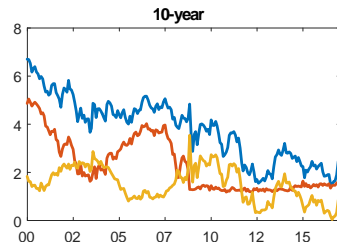
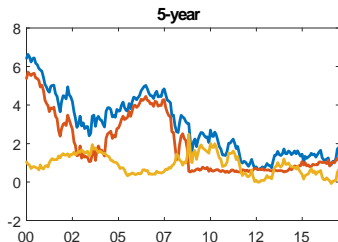
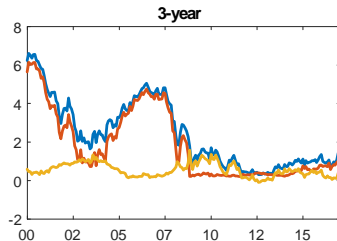
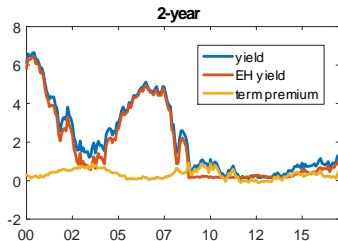
- RS model implies higher premia than 1-regime affine model recently.



ACM premium source: Adrian, Crump, Moench (2013)

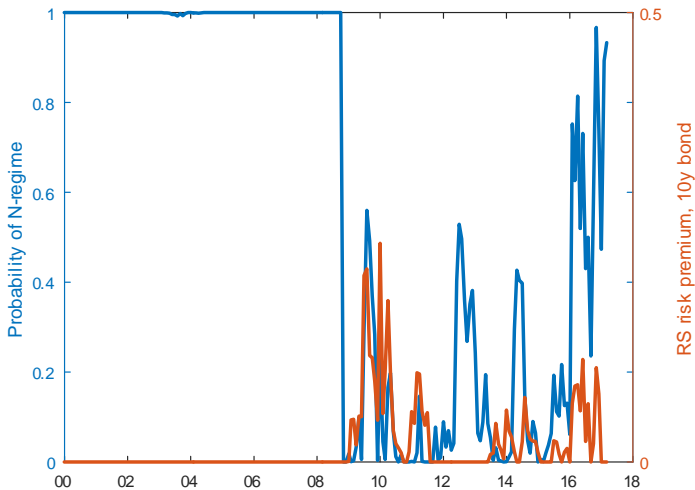
Expected short rate and term premia

- Interest rate expectations matter more for yields during normal times; the term premium dominates at the LB.



Is regime shift risk priced?

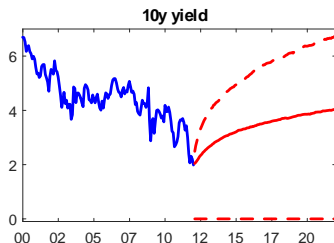
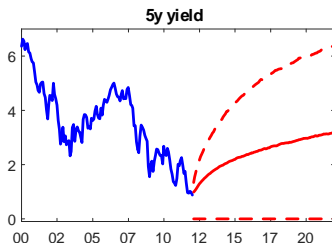
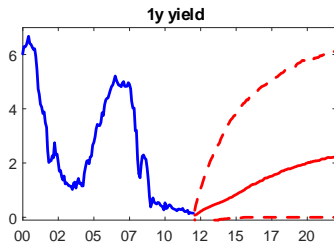
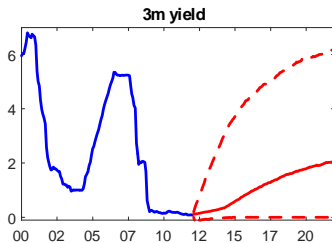
- Regime shift premia essentially zero during N -regime; small during L -regime.



Forecasts

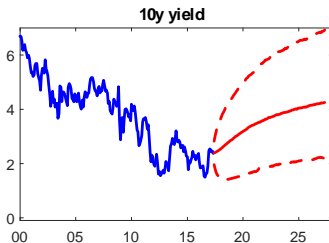
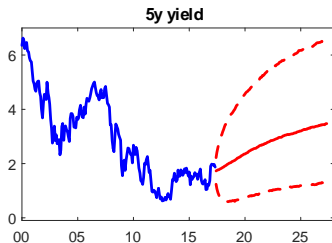
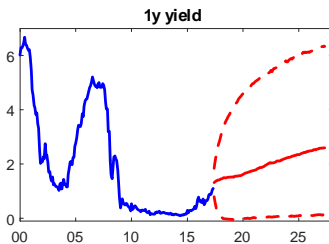
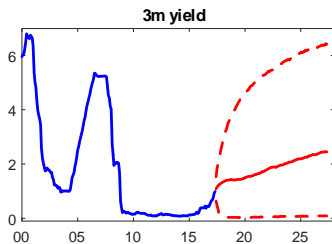
Yield forecasts at end-2011

- Wide confidence bands, but rate distributions do not include deeply negative values.



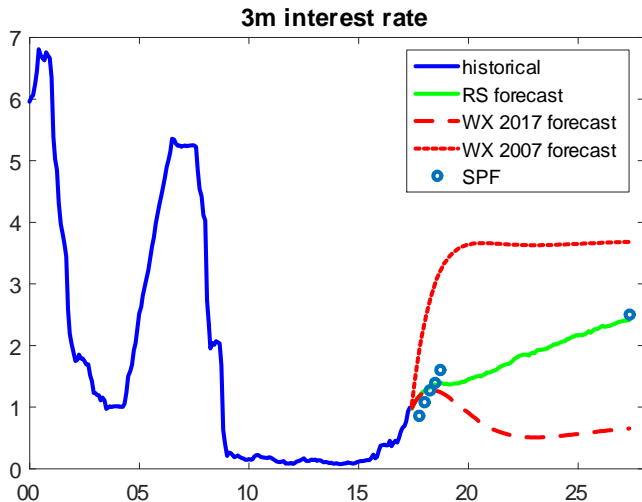
Yield forecasts at end-April 2017

- Gradual increase in interest rates and yields.



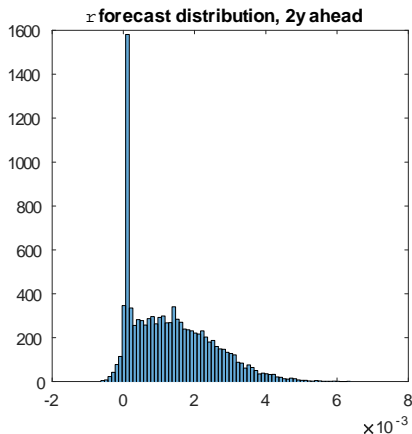
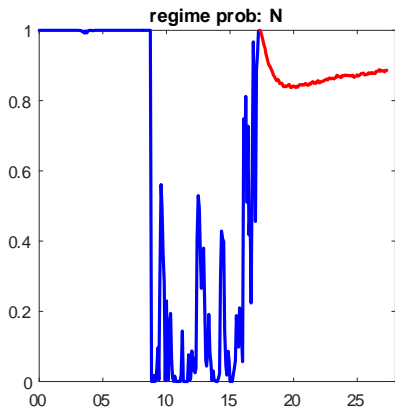
Short rate forecasts at end-April 2017

- Forecast from regime switching model more in line with SPF than shadow rate model (WX) forecasts.



Regime prob. forecast and short rate forecast distribution

- Highly skewed interest rate forecasts increases the future L -regime probability, influencing longer term bond pricing today



Concluding remarks

- We propose a dynamic term structure model with regime switches to account for lower bound spells
- Application to US term structure using yield factors: good fit; clear identification of regimes
- The RS model rules out a deeply negative policy rate (but allows it to dip below the estimated LB)
- Compared to an affine model: higher term premia in recent years / lower average expected policy rates
- Regime shift risk is priced by investors, but magnitude is small
- The model implies a slow pace of policy rate normalisation in coming years, in line with SPF forecasts