

# SHADOW INTEREST RATES, MACROECONOMIC TRENDS, & TIME-VARYING UNCERTAINTY

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**Federal Reserve Board**

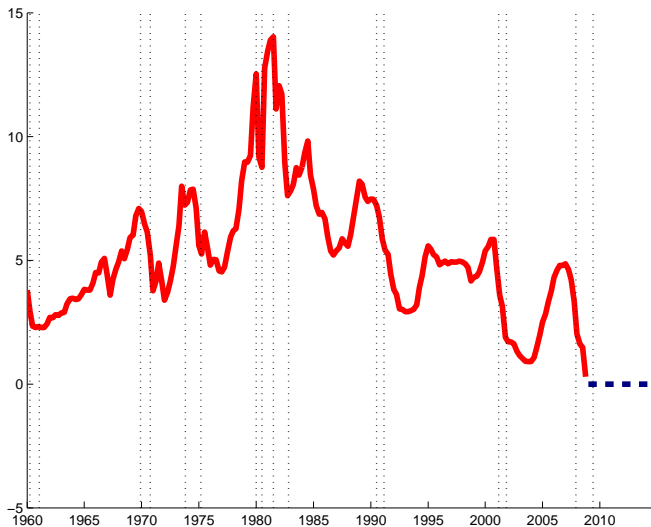
*The results presented here do not necessarily represent  
the views of the Federal Reserve System  
or the Federal Open Market Committee*

June 2015

# NOMINAL INTEREST RATE

## Three-month T-Bill (APR)

U.S. DATA



## Nominal short rate near zero since late 2008

- Typical time-series tools unusable (VARs, unobserved component models, time-varying parameter macro)
- How to measure variations in the stance of policy?

## Shadow rate approach

- Hypothetical nominal rate, unconstrained by lower bound
- Our focus: Pure time series approach

# SOME QUESTIONS

- ① What is the long-run level of the real rate, how does it relate to growth?
- ② How did the recent recession affect trends in real and nominal variables?
- ③ How does the term structure change with short rates near the lower bound?

### Macro-Time Series at the ZLB

Iwata & Wu (2006), Nakajima (2011),  
Chan & Strachan (2014)

### Dynamic Term-Structure Models

Kim & Wright (2005), Wright (2011),  
Kim & Singleton (2011), Krippner (2013), Wu & Xia (2014),  
Bauer & Rudebusch (2014)

### Unobserved Component Models of the Macroeconomy

Gordon (1997), Gerlach & Smets (1997),  
Staiger, Stock & Watson (1997), Laubach & Williams (2003),  
Clark & Kozicki (2005), Stock & Watson (2007),  
Stella & Stock (2013), Watson (2014), Mertens (2014)

# AGENDA

- 1 Shadow-Rate Concept
- 2 Shadow-Rate Sampling
- 3 Estimates from an Empirical Macro Model
- 4 Term-Premium Estimates

## Shadow Rate $i_t$

Nominal interest rate that would prevail  
in the absence of lower bound constraint

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## Key idea

Model  $i_t$  with conventional tools  
and handle max operator

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# AR(1) EXAMPLE

## Observer

$$i_t^* = \max(0, i_t)$$

## Shadow Rate as Latent State

$$(i_t - \bar{i}) = \rho (i_{t-1} - \bar{i}) + \sigma e_t$$

# AR(1) EXAMPLE

## Observer

$$i_t^* = \max(0, i_t)$$

## Shadow Rate as Latent State

$$(i_t - \bar{i}) = \rho^*(i_{t-1}^* - \bar{i}^*) + \sigma e_t$$

# AR(1) EXAMPLE

## Observer

$$i_t^* = \max(0, i_t)$$

## Shadow Rate as Latent State

$$(i_t - \bar{i}) = \rho (i_{t-1} - \bar{i}) + \rho^* (i_{t-1}^* - \bar{i}^*) + \sigma e_t$$

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$$i_t^* = \max(0, i_t)$$

## Shadow Rate as Latent State

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# AR(1) EXAMPLE

## Observer

$$i_t^* = \max(0, i_t)$$

## Shadow Rate as Latent State

$$(i_t - \bar{i}_t) = \rho_t (i_{t-1} - \bar{i}_{t-1}) + \sigma_t e_t$$

# SHADOW RATE SAMPLING

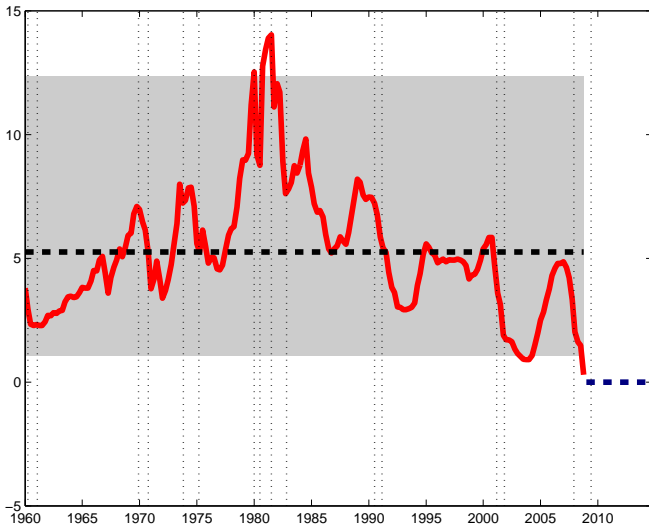
- Let  $Y^* = \begin{bmatrix} i_1^* \\ i_2^* \\ \vdots \\ i_T^* \end{bmatrix} = \max(0, Y)$
- Denote non-zero values of  $Y^*$  by  $X$
- Kalman smoother implies  $Y|X \sim N(\mu, V)$
- Thus  $Y^*|X \sim \text{trunc}N(\mu, V)$
- Model only needs to be conditionally linear



# NOMINAL INTEREST RATE

U.S. DATA

Three-month T-Bill (APR), 90 percent quantile range



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# TREND AND CYCLE IN NOMINAL INTEREST RATE

## Trend-cycle decomposition for the shadow rate

$$i_t = \bar{i}_t + \tilde{i}_t \quad \bar{i}_t = E_t i_{t+\infty} \quad \tilde{i}_t \sim I(0)$$

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## Taylor-type reaction function for the gap

$$\tilde{i}_t = \rho \tilde{i}_{t-1} + d_\pi (\pi_t - \bar{\pi}_t) + d_y (y_t - \bar{y}_t) + \varepsilon_t^i$$

# TREND-CYCLE MODEL FOR MACRO VARIABLES

## Observables

Real GDP:  $y_t = \bar{y}_t + \tilde{y}_t$

Unemployment rate:  $u_t = \bar{u}_t + \tilde{u}_t$

Inflation:  $\pi_t = \bar{\pi}_t + \tilde{\pi}_t$

Nominal Rate:  $i_t^* = \max(0, i_t) \quad i_t = \bar{r}_t + \bar{\pi}_t + \tilde{i}_t$

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## Trends

$$\bar{y}_t = \mu_{t-1} + \bar{y}_{t-1} + \bar{\varepsilon}_t^y \quad \mu_t = \mu_{t-1} + \eta_t^\mu$$

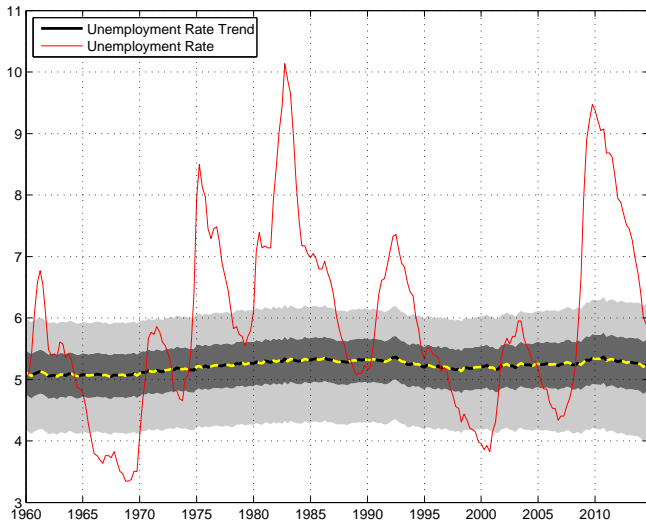
$$\bar{u}_t = \bar{u}_{t-1} + \bar{\varepsilon}_t^u$$

$$\bar{\pi}_t = \bar{\pi}_{t-1} + \bar{\varepsilon}_t^\pi$$

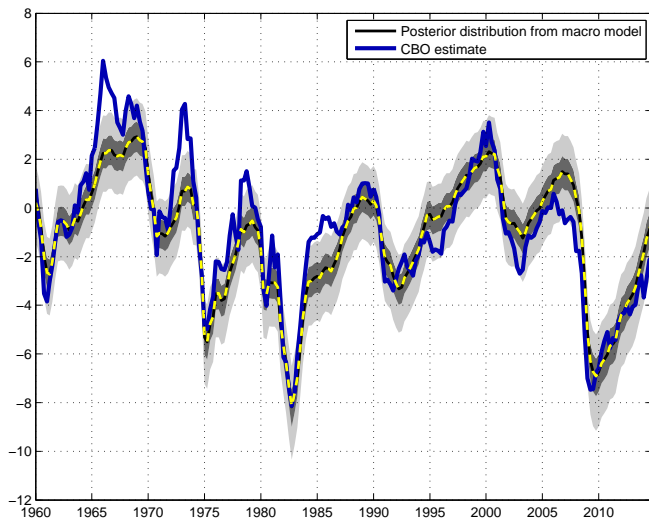
## Dynamic factor model for the gaps

$$a(L)\tilde{y}_t = \tilde{\varepsilon}_t \quad \tilde{u}_t = b_u(L)\tilde{y}_t + \varepsilon_t^u \quad \tilde{\pi}_t = b_\pi(L)\tilde{y}_t + \varepsilon_t^\pi$$

# TREND UNEMPLOYMENT



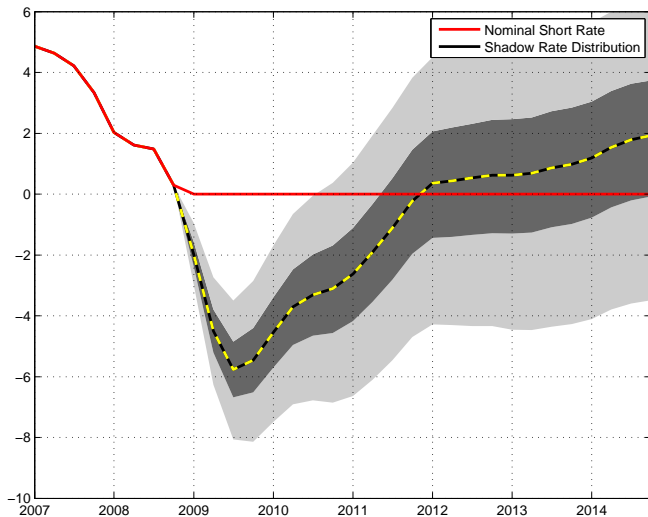
# OUTPUT GAP





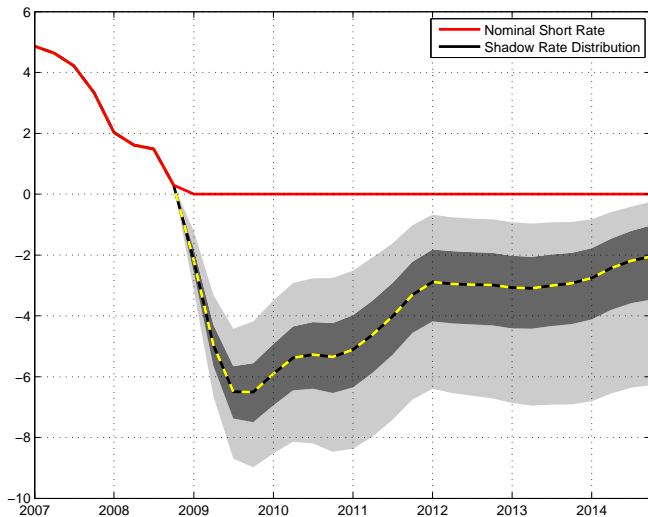
# SHADOW RATE ESTIMATES

$i_t^* = 0$  treated as missing data



# SHADOW RATE ESTIMATES

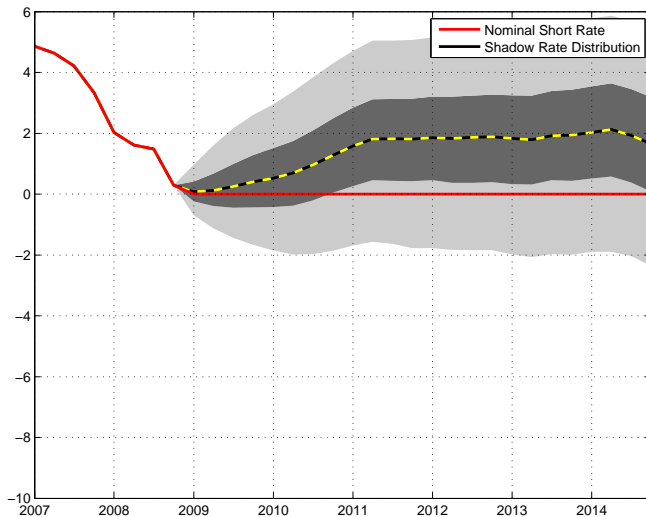
Censored sampling:  $i_t < 0$  when  $i_t^* = 0$



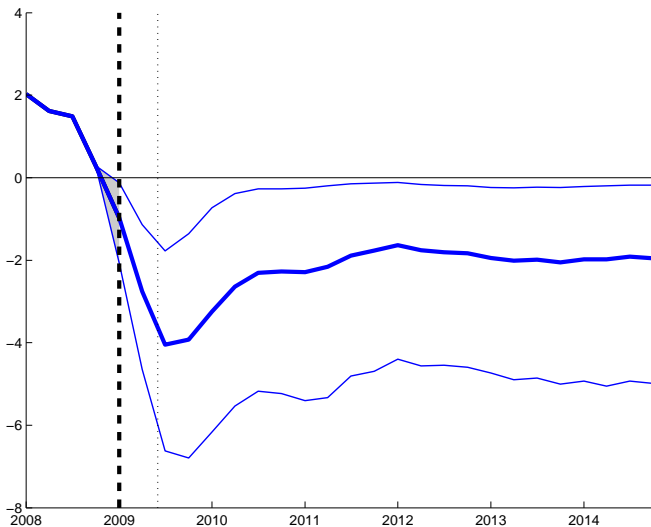
# SHADOW RATE ESTIMATES

BIVARIATE MODEL

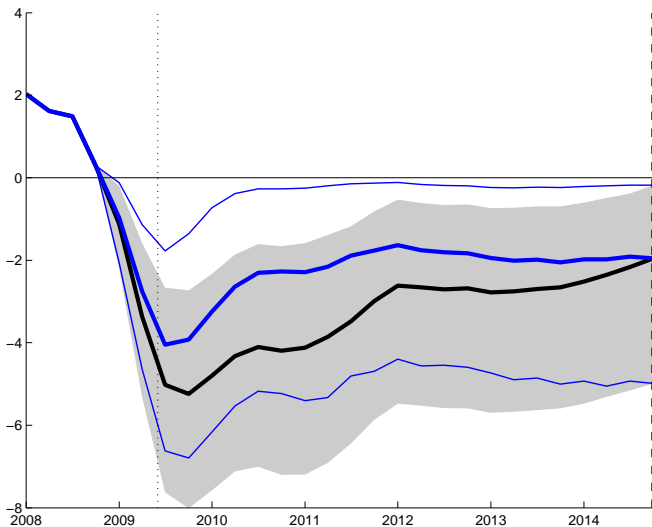
$i_t^* = 0$  treated as missing data



# SHADOW RATE ESTIMATES IN PSEUDO-REAL TIME



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# REAL (SHADOW) RATE TREND

## Real shadow-rate trend $\bar{r}_t$

$$\bar{i}_t = \bar{r}_t + \bar{\pi}_t$$

$$\begin{aligned}\bar{r}_t &= \bar{r}_{t-1} + e_t \\ &= \beta \cdot \mu_t + r_t^\perp\end{aligned}$$

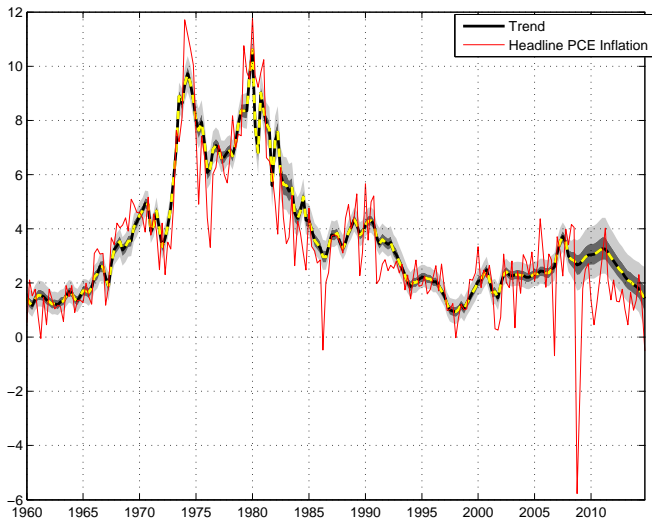
## Trend growth $\mu_t$

$$y_t = \bar{y}_t + \tilde{y}_t$$

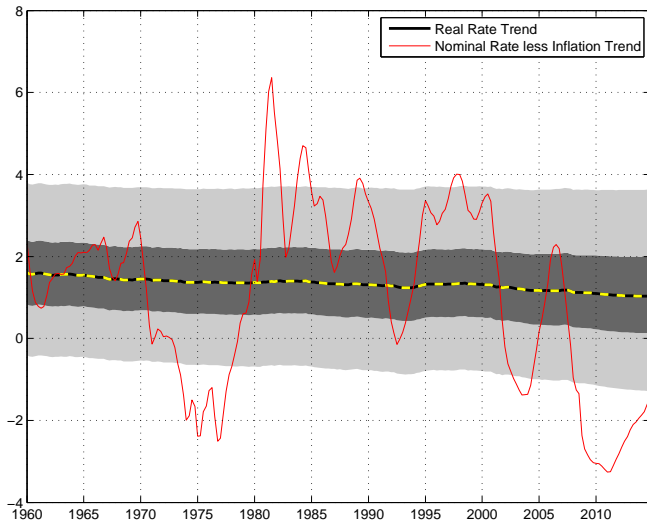
$$\bar{y}_t = \mu_{t-1} + \bar{y}_{t-1} + \bar{\varepsilon}_t^y$$

$$\mu_t = \mu_{t-1} + \eta_t^\mu$$

## Level



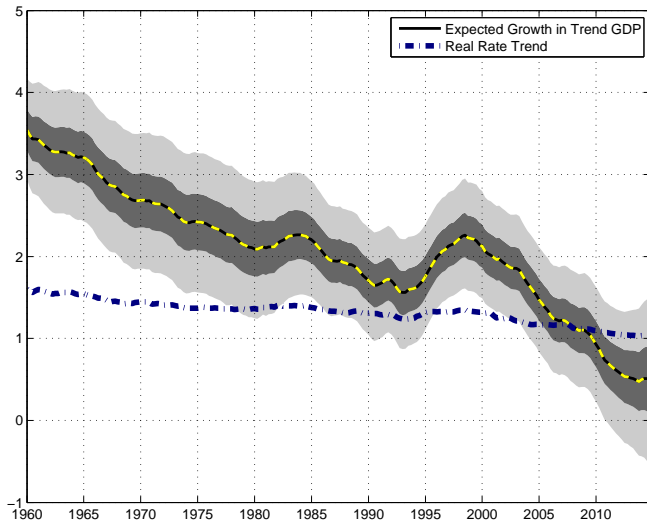
# REAL RATE TREND





# TREND GROWTH AND REAL RATE TREND

$$\bar{r}_t = \beta \cdot \mu_t + r_t^\perp$$



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## A decomposition for $h$ -period bond yield

$$i_{t,t+h}^* = \frac{1}{h} \sum_{j=0}^{h-1} E_t i_{t+j}^* + p_{t,t+h}$$

## Expected future short rates

$E_t i_{t+j}^*$ : mean of truncated predictive density for  $i_{t+j}$

$$\frac{\partial E_t i_{t+j}^*}{\partial E_t i_{t+j}} < 1 \quad \text{the more mass on } i_{t+j} < 0$$

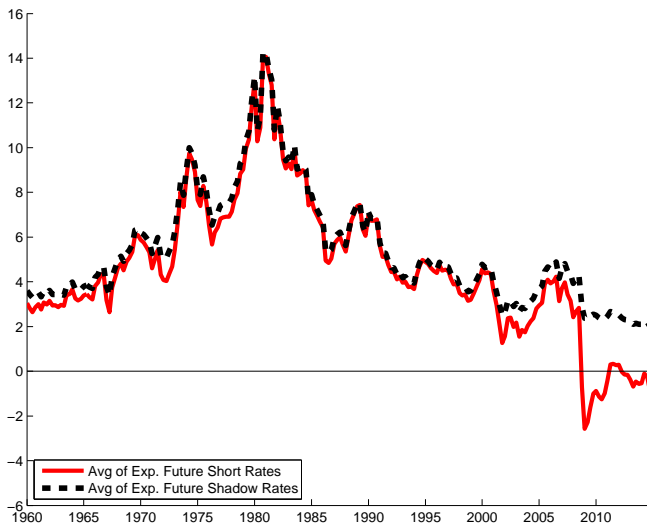
# LONG RATES AND EXPECTED FUTURE SHORT RATES

Expected future shadow rates (10-year avg)



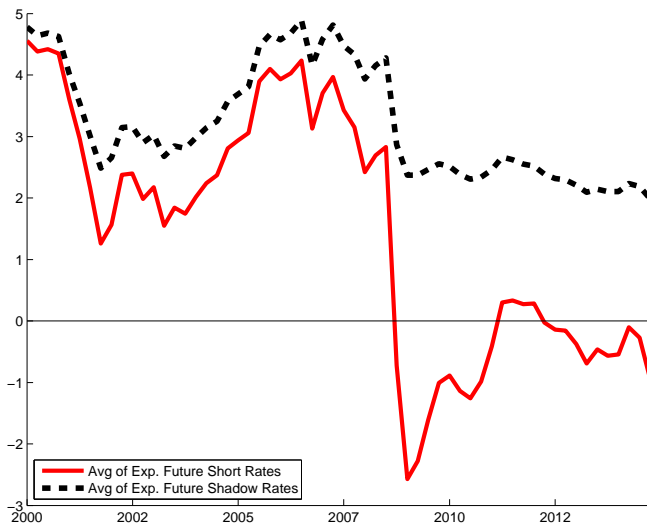
# LONG RATES AND EXPECTED FUTURE SHORT RATES

Expected future rates (actual vs. shadow, 10-year avg)



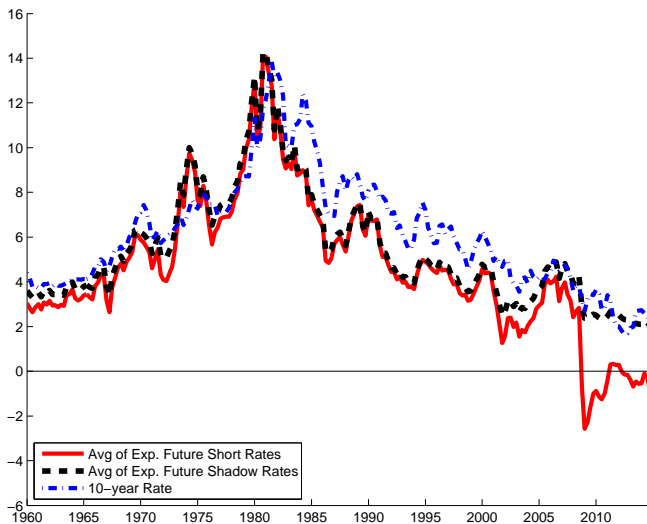
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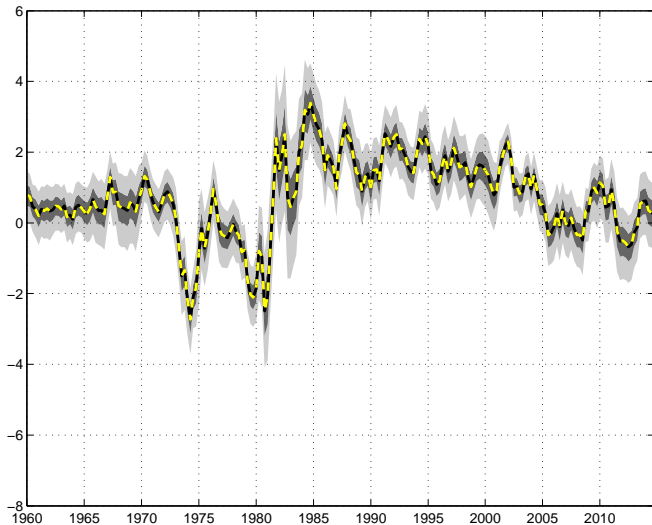
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# TERM PREMIUM ESTIMATES

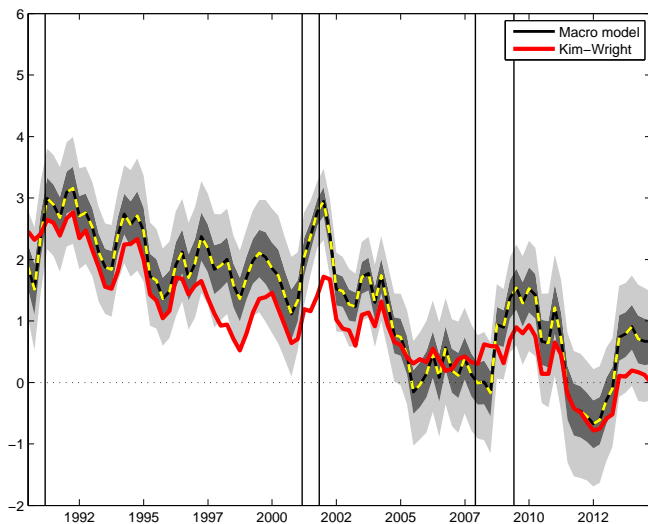
10-year rate





# TERM PREMIUM ESTIMATES

10-year rate



# SOME QUESTIONS

*and answers*

- ❶ **What is the long-run level of the real rate, how does it relate to growth?**

*Trend real rate depends only weakly on growth, stands currently at just about one percent*

- ❷ **How did the recent recession affect trends in real and nominal variables?**

*“Not much” as decline in trends started earlier*

- ❸ **How does the term structure change with short rates near the lower bound?**

*Expected future short rates get less sensitive to news*