

# Some Inference Perils of Imposing a TAYLOR Rule

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# Motivation

- Sticky prices models do not restrict much equilibrium allocations.
- What matters is the bundle {sticky prices , monetary policy}.

# Motivation

## An introductory example

- Basic 3-equation New-Keynesian model

$$y_t = E_t[y_{t+1}] - 1 \times (i_t - E_t[\pi_{t+1}]) + d_t, \quad (\text{Euler Equation})$$

$$\pi_t = 0.99 \times E_t[\pi_{t+1}] + 0.1 \times y_t + \mu_t. \quad (\text{Phillips Curve})$$

- Two "TAYLOR rules" :

$$i_t = 1.2 \times \pi_t + 0.25 \times y_t,$$

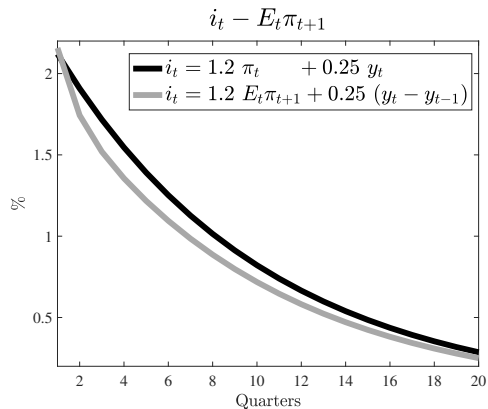
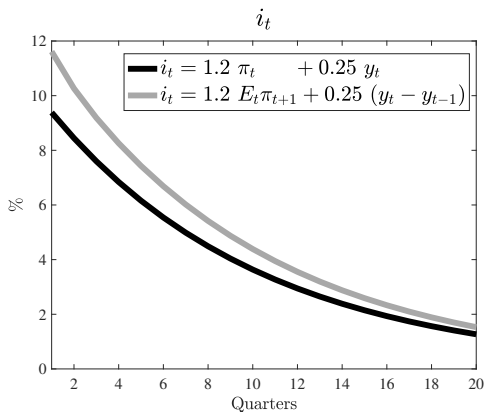
$$i_t = 1.2 \times E_t \pi_{t+1} + 0.25 \times (y_t - y_{t-1}).$$

- Shock  $d_0 = 2$ ,  $\mu_0 = 1$  (persistence .9 and .9).

# Motivation

An introductory example

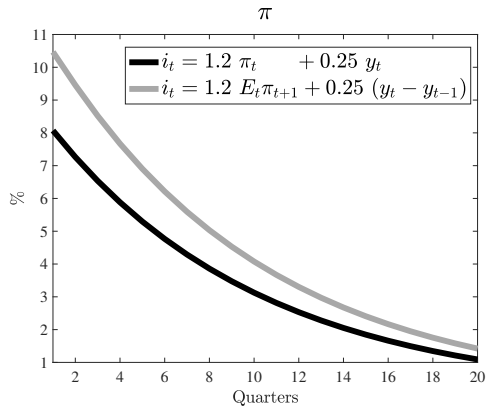
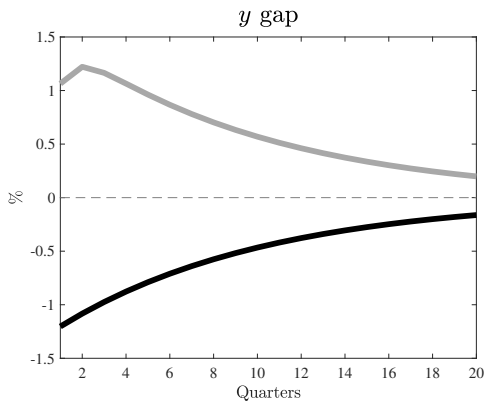
Response to a 2 s.d. demand shock *and* a 1 s.d. markup shock – Policy Instruments



# Motivation

An introductory example

Response to a 2 s.d. demand shock *and* a 1 s.d. markup shock – Output and inflation



# Motivation

- From that example, we see that the specification of the monetary policy rule matters big time.
- A lot of microfoundation efforts in estimated DSGE ...
- but not much thoughts<sup>1</sup> on how to specify the monetary policy rule ...
- *as if it should not matter...*
- although it does matter.

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<sup>1</sup>It is interesting to look back and see when, how and why TAYLOR rules were introduced in estimated models.

## What we do?

- Explore consequences of assuming (possibly wrongly) a TAYLOR rule when estimating NK models.
- Find it biases estimated deep parameters:
  - × *determination bias* in small models,
  - × *misspectification bias* in larger models.
- Solution: use an agnostic (linear, minimal) *state* monetary policy rule (that maps the state of the economy into an equilibrium allocation).
- (modest) Contribution: show that the monetary policy rule specification does matter *in practice* when estimating DSGEs, and to propose an alternative.

# Message

- It is a bad idea to estimate a NK DSGE assuming monetary authorities follow a TAYLOR rule.



## Literature

- There is a literature on optimal monetary policy – not our concern here.

## Important remark

- We follow the practice of restricting to determinate equilibria.
- In estimation, one identifying restriction is equilibrium determinacy.

# Roadmap

1. Abstract Approach
2. A Simple Three-Equation Estimated Model
3. Extensions

# Roadmap

1. Abstract Approach
2. A Simple Three-Equation Estimated Model
3. Extensions (Today SMETS & WOUTERS [2007])

# Roadmap

1. Abstract Approach
2. A Simple Three-Equation Estimated Model
3. Extensions

# 1. Abstract Approach

- Goal: show the possibility of a determinacy bias and a misspecification bias when using a TAYLOR rule
- The distinctive property of the TAYLOR rule is that it is a *feedback rule*.
- Start with the determinacy bias.

# 1. Abstract Approach

## Model

$$y_t = \alpha E_t y_{t+1} + \beta i_t + s_t, \quad 0 \leq \alpha < 1 \text{ and } \beta > 0,$$

$$s_t = \rho s_{t-1} + \varepsilon_t, \quad 0 \leq \rho < 1 \text{ and } V(\varepsilon) = 1.$$

–  $i$  is a policy variable that helps controlling  $y$ :

× feedback rule ( $\phi$  for *feedback*) (“TAYLOR rule”):

$$i_t = \phi y_t,$$

× (linear minimal) state rule ( $\sigma$  for *state*):

$$i_t = \sigma s_t.$$

# 1. Abstract Approach

Solution with a feedback rule  $i_t = \phi y_t$

–  $y_t = \alpha E_t y_{t+1} + \beta \underbrace{i_t}_{\phi y_t} + s_t.$

– Solving forward:

$$y_t = \frac{1}{1 - \beta\phi} \left( \sum_{j=0}^{\infty} \left( \frac{\alpha\rho}{1 - \beta\phi} \right)^j \right) s_t.$$

– Converges for any persistence parameter  $0 \leq \rho < 1$  if  $\left| \frac{\alpha}{1 - \beta\phi} \right| < 1.$

– Therefore, the restriction on policy to have determinacy (“TAYLOR principle”) is :

$$\phi \notin \left] \frac{1 - \alpha}{\beta}, \frac{1 + \alpha}{\beta} \right[ ,$$

– and solution is:

$$y_t = \frac{1}{1 - \beta\phi - \alpha\rho} s_t.$$



# 1. Abstract Approach

Solution with a state rule  $i_t = \sigma s_t$

–  $y_t = \alpha E_t y_{t+1} + \beta \underbrace{i_t}_{\sigma s_t} + s_t.$

– Solving forward:

$$y_t = (1 + \beta\sigma) \left( \sum_{j=0}^{\infty} (\alpha\rho)^j \right) s_t.$$

– *The sum converges for any policy choice  $\sigma$ ,*

– and solution is

$$y_t = \frac{1 + \beta\sigma}{1 - \alpha\rho} s_t.$$

# 1. Abstract Approach

## Equivalence

**Feedback rule**

$$i_t = \phi y_t$$

**Solution**

$$y_t = \frac{1}{1-\beta\phi-\alpha\rho} s_t$$

**State rule**

$$i_t = \sigma s_t$$

**Solution**

$$y_t = \frac{1+\beta\sigma}{1-\alpha\rho} s_t$$

# 1. Abstract Approach

Equivalent state rule  $\sigma^E$

**DGP = Feedback rule**

$$i_t = \phi y_t$$

**Solution**

$$y_t = \frac{1}{1 - \beta\phi - \alpha\rho} s_t$$

**State rule**

$$i_t = \sigma^E s_t$$

**Solution**

$$y_t = \frac{1 + \beta\sigma^E}{1 - \alpha\rho} s_t$$

- **Equivalent state rule:  $\sigma^E$  iff**

$$\frac{1}{1 - \beta\phi - \alpha\rho} = \frac{1 + \beta\sigma^E}{1 - \alpha\rho} \iff \sigma^E = \frac{\phi}{1 - \beta\phi - \alpha\rho}.$$

- *Any feedback rule allocation can be replicated by a state rule.*

# 1. Abstract Approach

Equivalent feedback rule  $\phi^E$

**Feedback rule**

$$i_t = \phi^E y_t$$

**DGP = State rule**

$$i_t = \sigma s_t$$

**Solution**

$$y_t = \frac{1}{1 - \beta\phi^E - \alpha\rho} s_t$$

**Solution**

$$y_t = \frac{1 + \beta\sigma}{1 - \alpha\rho} s_t$$

- **Equivalent feedback rule:**  $\phi^E$  must solve

$$\frac{1}{1 - \beta\phi^E - \alpha\rho} = \frac{1 + \beta\sigma}{1 - \alpha\rho} \iff \phi^E = \frac{\sigma(1 - \alpha\rho)}{1 + \beta\sigma}.$$

# 1. Abstract Approach

Equivalent feedback rule  $\phi^E$

**Feedback rule**

$$i_t = \phi^E y_t$$

**DGP = State rule**

$$i_t = \sigma s_t$$

**Solution**

$$y_t = \frac{1}{1 - \beta\phi^E - \alpha\rho} s_t$$

**Solution**

$$y_t = \frac{1 + \beta\sigma}{1 - \alpha\rho} s_t$$

- **Equivalent feedback rule:**  $\phi^E$  must solve

$$\frac{1}{1 - \beta\phi^E - \alpha\rho} = \frac{1 + \beta\sigma}{1 - \alpha\rho} \iff \phi^E = \frac{\sigma(1 - \alpha\rho)}{1 + \beta\sigma} \quad ? \notin \left] \frac{1 - \alpha}{\beta}, \frac{1 + \alpha}{\beta} \right[.$$

# 1. Abstract Approach

Equivalent feedback rule  $\phi^E$

**Feedback rule**

$$i_t = \phi^E y_t$$

**DGP = State rule**

$$i_t = \sigma s_t$$

**Solution**

$$y_t = \frac{1}{1 - \beta\phi^E - \alpha\rho} s_t$$

**Solution**

$$y_t = \frac{1 + \beta\sigma}{1 - \alpha\rho} s_t$$

– **Equivalent feedback rule:**  $\phi^E$  must solve

$$\frac{1}{1 - \beta\phi^E - \alpha\rho} = \frac{1 + \beta\sigma}{1 - \alpha\rho} \iff \phi^E = \frac{\sigma(1 - \alpha\rho)}{1 + \beta\sigma} \quad \begin{matrix} ? \\ \notin \end{matrix} \left] \frac{1 - \alpha}{\beta}, \frac{1 + \alpha}{\beta} \right[.$$

× If  $\sigma > -\frac{1 + \alpha}{2\alpha\beta}$ , then  $\phi^E$  will satisfy the determinacy condition.

× But if  $\sigma < -\frac{1 + \alpha}{2\alpha\beta}$ , there is no determinate feedback model that can reproduce the state rule allocations  $\rightsquigarrow$  *No equivalence*.

# 1. Abstract Approach

## Determination Bias

- Wrongly assuming a feedback rule can create a bias in estimation of deep parameters.
- This can be shown analytically in our abstract model.

# 1. Abstract Approach

Determinacy Bias: Estimating  $\alpha$

- Here an extreme example for which the bias can be analytically computed.
- Only  $y$  is observed.
- All parameters are known ( $\beta, \rho, \phi$  or  $\sigma^E, \sigma$  or  $\phi^E$ ) but  $\alpha$ .

$$y_t = \alpha E_t y_{t+1} + \beta i_t + s_t.$$

- $\alpha$  can be estimated (ML) by matching the observed variance of  $y$ :  $V_y$ .
- Assume true  $\alpha = .9$ .



# 1. Abstract Approach

Possible Bias when Estimating  $\alpha$

- Assume the DGP is the feedback rule ( $\phi$ ) but the econometrician believes it is a state rule model.

**State rule**

$$i_t = \sigma^E s_t$$

**Solution**

$$y_t = \frac{1 + \beta\sigma^E}{1 - \hat{\alpha}\rho} s_t$$

$$\mathbf{V}^\sigma(\hat{\alpha}) \\ \left( \frac{1 + \beta\sigma^E}{1 - \hat{\alpha}\rho} \right)^2 \frac{1}{1 - \rho^2}$$

**Feedback rule**

$$i_t = \phi y_t$$

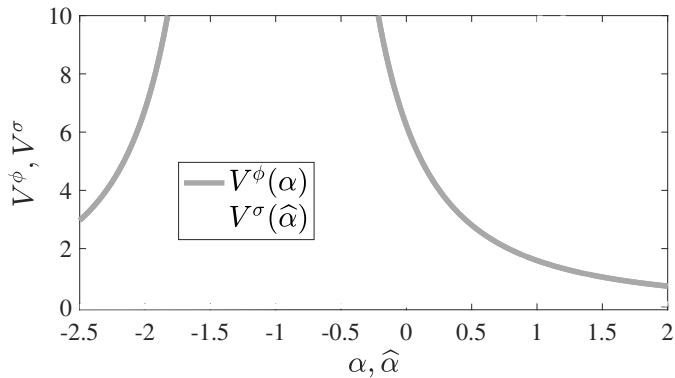
**Solution**

$$y_t = \frac{1}{1 - \beta\phi - \alpha\rho} s_t$$

$$\mathbf{V}^\phi(\alpha) \\ \frac{1}{(1 - \beta\phi - \alpha\rho)^2} \frac{1}{1 - \rho^2}$$

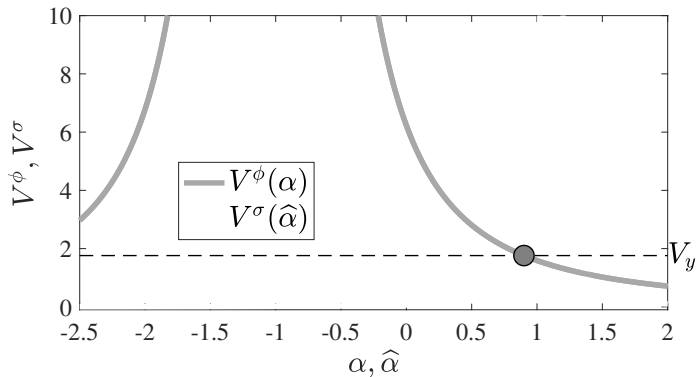
# 1. Abstract Approach

DGP is  $\phi$ , econometrician believes it is  $\sigma$



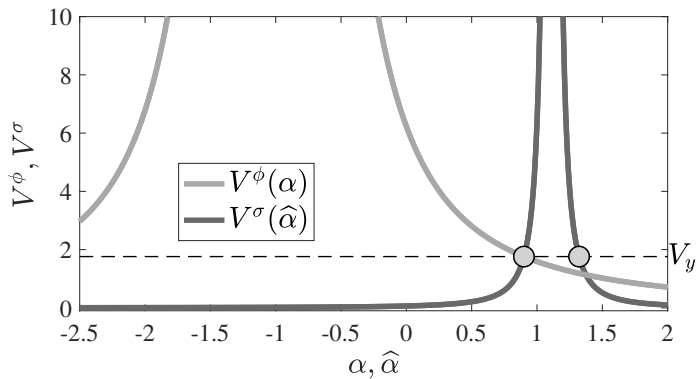
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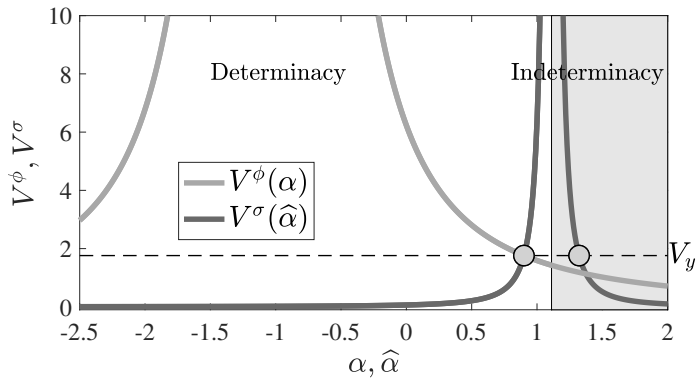
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DGP is  $\phi$ , econometrician believes it is  $\sigma$



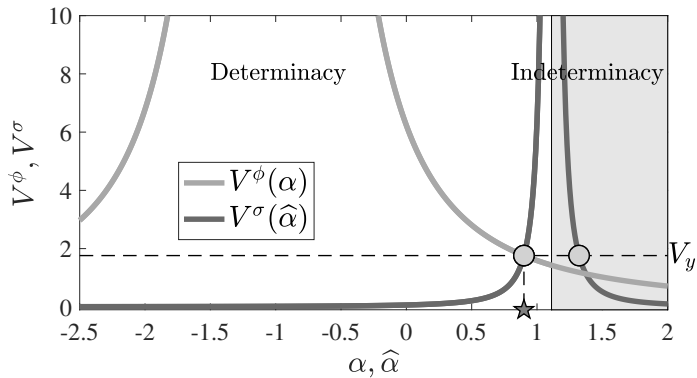
# 1. Abstract Approach

DGP is  $\phi$ , econometrician believes it is  $\sigma$



# 1. Abstract Approach

DGP is  $\phi$ , econometrician believes it is  $\sigma$



# 1. Abstract Approach

## Possible Bias when Estimating $\alpha$

- Assume now that the DGP is the state rule ( $\sigma$ ) but the econometrician believes it is a feedback rule model.
- If  $\sigma \rightsquigarrow \phi^E$  that is not in the determinacy zone: biased estimation of  $\alpha$ .

### Feedback rule

$$i_t = \phi^E y_t$$

### Solution

$$y_t = \frac{1}{1 - \beta\phi^E - \hat{\alpha}\rho} s_t$$

$$\mathbf{V}^\phi(\hat{\alpha})$$

$$\frac{1}{(1 - \beta\phi^E - \hat{\alpha}\rho)^2} \frac{1}{1 - \rho^2}$$

### State rule

$$i_t = \sigma s_t$$

### Solution

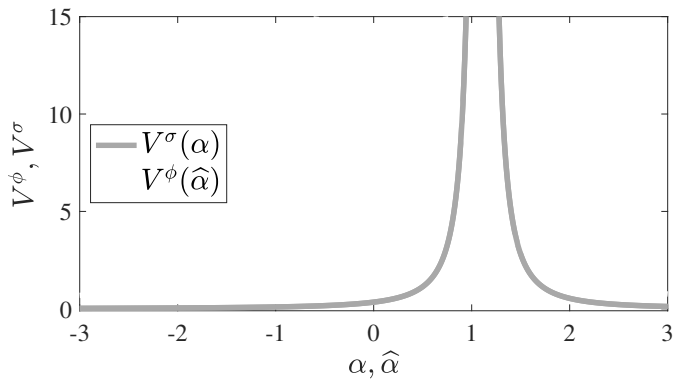
$$y_t = \frac{1 + \beta\sigma}{1 - \alpha\rho} s_t$$

$$\mathbf{V}^\sigma(\alpha)$$

$$\left(\frac{1 + \beta\sigma}{1 - \alpha\rho}\right)^2 \frac{1}{1 - \rho^2}$$

# 1. Abstract Approach

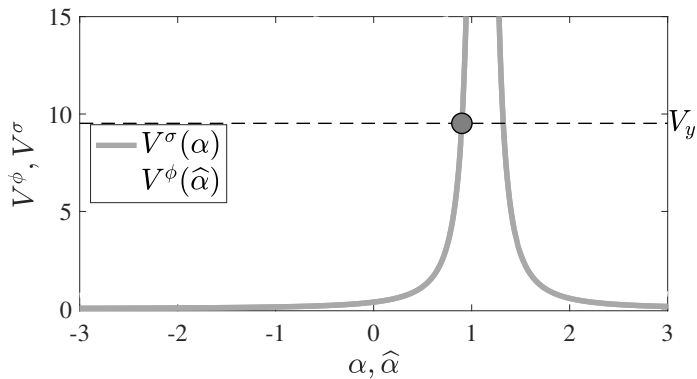
DGP is  $\sigma$ , econometrician believes it is  $\phi$  – Determinacy bias





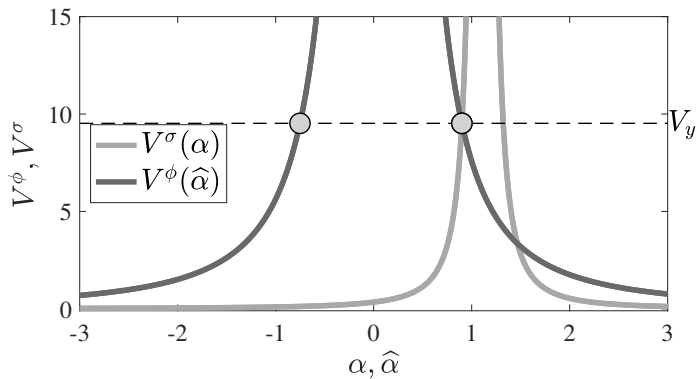
# 1. Abstract Approach

DGP is  $\sigma$ , econometrician believes it is  $\phi$  – Determinacy bias



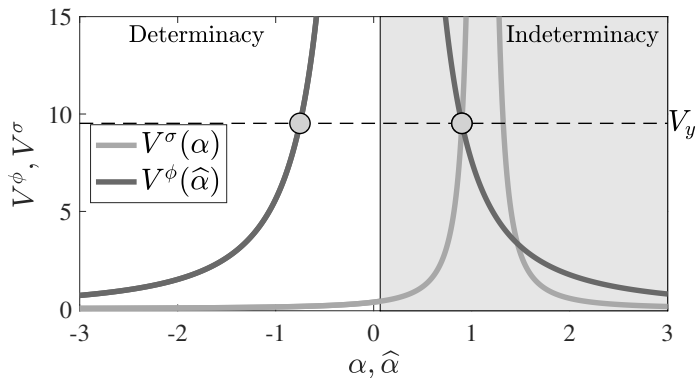
# 1. Abstract Approach

DGP is  $\sigma$ , econometrician believes it is  $\phi$  – Determinacy bias



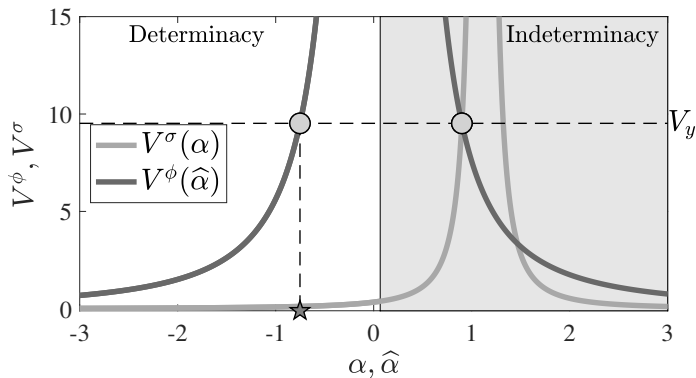
# 1. Abstract Approach

DGP is  $\sigma$ , econometrician believes it is  $\phi$  – Determinacy bias



# 1. Abstract Approach

DGP is  $\sigma$ , econometrician believes it is  $\phi$  – Determinacy bias



# 1. Abstract Approach

## Remarks

- As  $\alpha$  is just identified, the fit of the model is the same, even if  $\hat{\alpha}$  is biased.
- This is not the standard *misspecification bias* (see next).
- Let's call it a *determinacy bias*.

# 1. Abstract Approach

## Misspecification bias

- Static model

$$y_t = \beta i_t + s_{1t} + \gamma s_{2t},$$

- Rules:

Feedback rule

$$i_t = \phi y_t + \nu_t$$

State rule

$$i_t = \sigma_1 s_{1t} + \sigma_2 s_{2t} + \nu_t$$

- Bias in estimating  $\gamma$  for  $\beta$  and shock variances known if feedback rule wrongly assumed.

# 1. Abstract Approach

- Are there evidence of determinacy and specification bias when estimating DSGE-like models?
- Yes

# Roadmap

1. Abstract Approach
2. A Simple Three-Equation Estimated Model
3. Extensions



## 2. A Simple Three-Equation Estimated Model

$$y_t = \alpha_y E_t[y_{t+1}] - \alpha_r r_t + d_t, \quad (\text{Euler Equation})$$

$$\pi_t = \beta E_t[\pi_{t+1}] + \kappa y_t + \mu_t, \quad (\text{Phillips Curve})$$

$$r_t = \begin{cases} -E_t \pi_{t+1} + \phi_y y_t + \phi_\pi \pi_t + \nu_t, & (\text{TAYLOR Rule}) \quad (\phi \text{feedback}) \\ \sigma_d d_t + \sigma_\mu \mu_t + \tilde{\nu}_t. & (\text{Real rate Rule}) \quad (\sigma \text{tate}) \end{cases}$$

- Remark 1:  $|\alpha_y| < 1 \rightsquigarrow$  always determinacy under RR (and  $\alpha_y$  can be arbitrarily close to 1)
- Remark 2: Same deep parameters are estimated if monetary policy is

$$y_t = \sigma'_d d_t + \sigma'_\mu \mu_t + \hat{\nu}_t \quad (\text{Another Monetary Policy State Rule})$$

## 2. A Simple Three-Equation Estimated Model

### Estimation

- US data, 1959Q1-2019Q4.
- Output gap from the CBO, log difference of the CPI for inflation, Federal Funds rate for  $i$ .
- The shadow Federal Funds rate from Wu and Xia (2016) is used from 2009 onwards - the period when the zero lower bound might be a binding constraint.
  
- Bayesian estimation

## 2. A Simple Three-Equation Estimated Model

Calibrated and estimated coefficients

$$\begin{aligned}y_t &= 0.999 \times E_t[y_{t+1}] - 1 \times r_t + d_t, && \text{(Euler Equation)} \\ \pi_t &= 0.99 \times E_t[\pi_{t+1}] + \kappa y_t + \mu_t, && \text{(Phillips Curve)} \\ r_t &= \begin{cases} -E_t \pi_{t+1} + \phi_y y_t + \phi_\pi \pi_t + \nu_t, & \text{(TAYLOR Rule)} \\ \sigma_d d_t + \sigma_\mu \mu_t + \tilde{\nu}_t. & \text{(State Rule)} \end{cases} \\ d_t &= \rho_d d_{t-1} + \sigma_d \varepsilon_{dt} && \text{(Demand shock)} \\ \mu_t &= \rho_\mu \mu_{t-1} + \sigma_\mu \varepsilon_{\mu t} && \text{(Supply shock)} \\ \nu_t &= \rho_\nu \nu_{t-1} + \sigma_\nu \varepsilon_{\nu t} && \text{(Monetary shock)}\end{aligned}$$

## 2. A Simple Three-Equation Estimated Model

### Results

Estimated Slope of the Phillips Curve, TAYLOR rule *versus* State Rule

TAYLOR Rule		State Rule	
$\kappa$	0.68	$\kappa$	0.006
	(0.06)		(0.001)

- Here the State Rule is expressed as a Real rate Rule.

## 2. A Simple Three-Equation Estimated Model

Determinacy bias

Estimated and Implied Policy Parameters

TAYLOR Rule		Real rate Rule	
$\phi_\pi$	1.77		
$\phi_y$	-0.01		
		$\sigma_d$	0.97
		$\sigma_\mu$	-0.46

## 2. A Simple Three-Equation Estimated Model

Determinacy bias

Estimated and Implied Policy Parameters

TAYLOR Rule		Real rate Rule	
$\phi_\pi$	1.77	$\phi_\pi^E$	-0.24
$\phi_y$	-0.01	$\phi_y^E$	0.68
		$\sigma_d$	0.97
		$\sigma_\mu$	-0.46

The equivalent TAYLOR rule does not satisfy TAYLOR principle  $\rightsquigarrow$  There is a determinacy bias.

# Roadmap

1. Abstract Approach
2. A Simple Three-Equation Estimated Model
3. Extensions (Today SMETS & WOUTERS [2007])

### 3. Extensions

SMETS & WOUTERS [2007]

- Large model with 7 shocks, 36 estimated coefficients, 19 state variables
- 7 observable series, Bayesian estimation
- Estimated TAYLOR Rule in S&W:

$$i_t = \rho i_{t-1} + (1 - \rho) \left( \phi_\pi \pi_t + \phi_y (y_t - y_t^f) \right) + \phi_{\Delta y} \left( (y_t - y_t^f) - (y_{t-1} - y_{t-1}^f) \right) + \varepsilon_t^i$$

- The Real rate Rule (The State Rule):

$$\begin{aligned} r_t - E_t \pi_{t+1} &= \sigma_a \varepsilon_t^a + \sigma_b \varepsilon_t^b + \sigma_g \varepsilon_t^g + \sigma_{i^s} \varepsilon_t^i + \sigma_{p^{inf}} \varepsilon_t^p + \sigma_{w^s} \varepsilon_t^w + \sigma_{\eta^w} \eta_{t-1}^w \\ &+ \sigma_{\eta^p} \eta_{t-1}^p + \sigma_{y^p} y_{t-1}^p + \sigma_y y_{t-1} + \sigma_r r_{t-1} + \sigma_{k^{p,s}} k_t^{p,s} + \sigma_{k^s} k_t^s \\ &+ \sigma_{c^p} c_{t-1}^p + \sigma_{i^p} i_{t-1}^p + \sigma_c c_{t-1} + \sigma_i i_{t-1} + \sigma_\pi \pi_{t-1} + \sigma_w w_{t-1} + \varepsilon_t^R \end{aligned}$$

- Is the Central Bank information set realistic?  $\rightsquigarrow$  If not, some  $\sigma_x$  will be zero.



### 3. Extensions

SMETS & WOUTERS [2007]

- No sign of determinacy bias with the SW extended TAYLOR rule.

	S&W TAYLOR Rule	Implied TAYLOR Rule
$\phi_{\pi}$	1.84	1.43
$\phi_y$	0.11	0.00
$\rho$	0.87	0.84
$\phi_{\Delta y}$	0.25	0.17

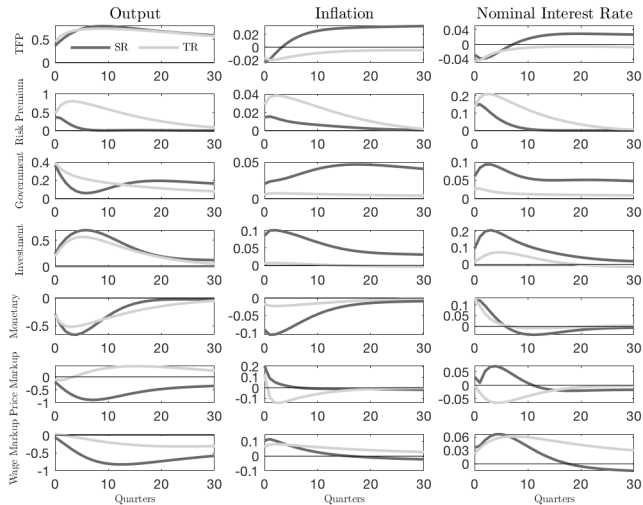
### 3. Extensions

SMETS & WOUTERS [2007]

- But evidence of misspecification bias:
- Parameters posterior distributions are pretty different  $\rightsquigarrow$  impulse responses and variance decomposition are pretty different.
- Reminder: the (state) real rate rule *encompasses* the TAYLOR rule.

### 3. Extensions

SMETS & WOUTERS [2007]: TAYLOR Rule (TR) and State Rule (SR):  
misspecification bias



### 3. Extensions

SMETS & WOUTERS [2007]: Misspecification bias

#### Inflation Unconditional Variance Decomposition (in %)

	State rule	Smets-Wouters
TFP		2
Risk Premium		6
Government Spending		1
Investment Technology		0
Monetary Policy		2
Price Markup		47
Wage Markup		41

### 3. Extensions

SMETS & WOUTERS [2007]: Misspecification bias

#### Inflation Unconditional Variance Decomposition (in %)

	State rule	Smets-Wouters
TFP	16	2
Risk Premium	0	6
Government Spending	16	1
Investment Technology	21	0
Monetary Policy	13	2
Price Markup	14	47
Wage Markup	20	41

## Conclusion

- Specification of the monetary policy rule matters big time
- Evidence of both determinacy and misspecification bias.
- We recommend to use a state monetary policy rules,
- At least check if results change a lot with a state rule.

