

# The dangers of policy experiments

## Initial beliefs under adaptive learning

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# Motivation

- Last 12 years
  - Global Financial Crisis
  - Recessions
  - Sovereign Debt crisis
  - COVID-19
  - decline in the natural real interest rates,
  - periods of nominal interest rate at ZLB/ELB,
  - lower inflation:  $\sim 2\%$  (1999-2009) vs  $1.2\%$  (2010-2021) in Euroarea
  
- Challenges for conventional policy
  
- New policy instruments ( temporary/permanent (?) )
  - Monetary policy: credit easing, asset purchases, forward guidance,...
  - Macroprudential policy: LtV, debt-service ratio (DSR),...
  - Fiscal policy
  
- Discussion on policy frameworks
  - MP:  $\pi^*$ , IT, PLT, NGDPT, AIT,...
  - Macro-Pru: systemic risk, FSB, Basel III,IV,...

# Choosing policy

- Model-based approach to choosing policies
  - build a model
  - analyze the effect of policy
  - choose the best one (criterion)
- Lucas critique
  - the outcome of policy depends on expectations
- The success of new tools/policies depends on
  - expectations
  - communication
- Expectations
  - rational expectations
  - bounded rationality
  - learning

# Rational Expectations in Reality?

- Can agents have rational expectations ?
- Rational expectations
  - require detailed knowledge concerning nature of equilibrium in the economy or economic situation,
  - assume agents know
    - as much as the modeler,
    - more than the econometrician.
  - agents understand and internalize new policy
    - new instrument
    - new policy
    - new strategy

# What we do

- Show the effect of expectations about policy and learning
- Model with collateral constraint
  - use a variant of Kiyotaki and Moore (1997) based on Pintus and Suda (2019).
- Replace rational expectations (RE) with *adaptive learning*.
- Calibrate/estimate the model using US data from 1975Q1-2008/10Q4 period.
- Focus on initial beliefs regarding the policy
  - effects of deviations of agents beliefs from RE
  - effects of deviations of agents beliefs from actual policy
- Compare the responses under both RE and learning for different priors.

# What we find

- Initial beliefs matter a lot!
  - priors affect the evolution of beliefs,
  - ... and dynamics of endogenous variables.
- Change / introduction of new policy that reduces volatility and exposure to shocks under learning may not work if the change unannounced or unexpected
  - Agents gradually learn the structure of the economy (and the policy)
  - The transition associated with high volatility
- Learning behaviour generates time-varying dynamics in beliefs
  - it can result in deviations from RE for the system under AL

# Representative agent

- A representative agent solves:

$$\max E_0^* \sum_{t=0}^{\infty} \beta^t \frac{\left[ C_t - \psi \frac{N_t^{1+\chi}}{1+\chi} \right]^{1-\sigma} - 1}{1-\sigma},$$

subject to:

- budget constraint

$$C_t + K_{t+1} - (1 - \delta)K_t + T_t Q_t (L_{t+1} - L_t) + (1 + R)B_t = B_{t+1} + AK_t^\alpha L_t^\gamma N_t^{1-\alpha-\gamma}$$

- exogenous interest rate (SOE)
- $E_t^*$  denotes expectations at time  $t$ .
- $T_t$  is a shortcut for land demand shock.

# Borrowing constraint

- Agents face borrowing constraint

$$\tilde{\Theta}_t E_t^* [Q_{t+1}] L_{t+1} \geq (1 + R) B_{t+1},$$

where

$$\tilde{\Theta}_t \equiv \Theta_t \left\{ \frac{E_t^* [Q_{t+1}]}{Q} \right\}^\varepsilon$$

- We allow leverage to respond to changes in the land price:
  - microfounded in simple moral hazard setting,
  - $\varepsilon > 0$  agrees with evidence in Mian and Sufi (2011) on US micro data for the 2000s.



# Leverage process

- $\Theta_t$  is exogenous and subject to random shocks

$$\Theta_t = \bar{\Theta}^{1-\rho_\theta} \Theta_{t-1}^{\rho_\theta} \Xi_t.$$

- $\Xi_t$ : leverage shocks,
  - $\bar{\Theta}$ : mean (steady-state) leverage level,
  - $\rho_\theta$ : persistence of impact of leverage shocks,
  - agents learn  $\rho_\theta$  (and possibly  $\bar{\Theta}$ ).
- Similarly  $T_t$  is subject to random shocks

$$T_t = T_{t-1}^{\rho_T} \Psi_t$$

- Borrowers' first-order conditions are

$$\begin{aligned}
 C_t : \quad \Lambda_t &= \left[ C_t - \psi \frac{N_t^{1+\chi}}{1+\chi} \right]^{-\sigma} \\
 N_t : \quad \psi N_t^{\chi+\alpha+\gamma} &= (1 - \alpha - \gamma) A K_t^\alpha L_t^\gamma \\
 L_{t+1} : \quad T_t Q_t \Lambda_t &= \beta E_t^* [T_{t+1} Q_{t+1} \Lambda_{t+1}] + \beta \gamma E_t^* [\Lambda_{t+1} Y_{t+1} / L_{t+1}] \\
 &\quad + \Phi_t \tilde{\Theta}_t E_t^* [Q_{t+1}], \\
 K_{t+1} : \quad \Lambda_t &= \beta E_t^* [\Lambda_{t+1} (\alpha Y_{t+1} / K_{t+1} + 1 - \delta)] \\
 B_{t+1} : \quad \Lambda_t &= \beta (1 + R) E_t^* [\Lambda_{t+1}] + (1 + R) \Phi_t
 \end{aligned}$$

## REE

- Linearized expectational system (in log levels):

$$X_t = \mathbf{A}X_{t-1} + \mathbf{B}E_{t-1}^*[X_t] + \mathbf{C}E_t^*[X_{t+1}] + \mathbf{N} + \mathbf{D}\xi_t + \mathbf{F}\psi_t,$$

$X_t' \equiv (c_t, q_t, \lambda_t, \phi_t, b_t, k_t, \theta_t, \tau_t)$ ,  $\xi_t$  and  $\psi_t$  are innovations.

- Under REE,  $E_t^* = E_t$  and there exists a unique stationary equilibrium

$$X_t = \mathbf{M}^{\text{re}}X_{t-1} + \mathbf{H}^{\text{re}} + \mathbf{G}^{\text{re}}\xi_t + \mathbf{J}^{\text{re}}\psi_t,$$

where  $\mathbf{M}^{\text{re}}$  and  $\mathbf{H}^{\text{re}}$  solve

$$\mathbf{M} = [\mathbf{I}_8 - \mathbf{C}\mathbf{M}]^{-1}[\mathbf{A} + \mathbf{B}\mathbf{M}],$$

$$\mathbf{H} = [\mathbf{I}_8 - \mathbf{C}\mathbf{M}^{\text{re}}]^{-1}[\mathbf{B}\mathbf{H} + \mathbf{C}\mathbf{H} + \mathbf{N}]$$

# Learning

- Relax RE assumption:  $E_t^* \neq E_t$ .
- Agents as econometricians:
  - Endow agents with a perception of the equilibrium law of motion (PLM)

$$X_t = \mathbf{M}X_{t-1} + \mathbf{H} + \mathbf{G}\xi_t + \mathbf{J}\psi_t,$$

- has the same VAR(1) structure as RE equilibrium, but admits  $\mathbf{M} \neq \mathbf{M}^{\text{re}}$ ,  $\mathbf{H} \neq \mathbf{H}^{\text{re}}$ ,  $\mathbf{G} \neq \mathbf{G}^{\text{re}}$ ,  $\mathbf{J} \neq \mathbf{J}^{\text{re}}$ .
- Agents update their “beliefs” by estimating a VAR(1).
- Agents use PLM to form expectations

$$E_{\tau}X_{\tau+1} = \mathbf{M}_{\tau-1}X_{\tau} + \mathbf{H}_{\tau-1}$$

# Learning

- Agents as econometricians:
  - Actual law of motion becomes

$$[\mathbf{I}_8 - \mathbf{C}\mathbf{M}_{t-1}]X_t = [\mathbf{A} + \mathbf{B}\mathbf{M}_{t-2}]X_{t-1} + [\mathbf{B}\mathbf{H}_{t-2} + \mathbf{C}\mathbf{H}_{t-1} + \mathbf{N}] + \mathbf{D}\xi_t + \mathbf{F}\psi_t$$

- Assume recursive updating of the perceived law of motion

$$\Omega_t = \Omega_{t-1} + \nu(X_t - \Omega_{t-1}Z_{t-1})Z'_{t-1}\mathbf{R}_t^{-1}$$

$$\mathbf{R}_t = \mathbf{R}_{t-1} + \nu(Z_{t-1}Z'_{t-1} - \mathbf{R}_{t-1}),$$

where  $Z'_t = [1, X'_t]$  and  $\Omega = [\mathbf{H} \quad \mathbf{M}]$

- OLS/RLS if  $\nu_t = 1/t$ ,
  - constant gain if  $\nu_t = \nu$ .
- REE: perceived and actual laws of motions coincide.

# Experiment

- Agents learn and at the onset of the recession
  - the associated matrix in PLM is  $\mathbf{M}_{2008Q4}$ .
  - if agents have learned/estimated  $\rho_\theta$ , matrix  $\mathbf{M}_{2008Q4}$  reflects that.
- Shocks and beliefs (under learning) affects financial constraint.
- Given the stochastic process, in 2008Q4 agents' perception does not match the *true* process  $\mathbf{M}_{2008Q4} \neq \mathbf{M}^{RE}$ .
- The actual law of motion will reflect that.

# Set-up: calibration

- Calibration:

- Model delivers average values for debt-to-GDP and land value-to-GDP ratios for the period 1996Q1- 2008Q4:  $B/Y \approx 0.52$  and  $QL/Y \approx 0.59$

$\mu$	$\beta$	$\delta$	$\alpha$	$\gamma$	$\varepsilon$	$\nu$
0.99	$0.96\mu$	0.025	0.33	0.0093	0.5	0.004

- Gain parameter:

- Constant gain learning parameter:  $\nu_t = 0.004$   
(regression with forgetting half-length of 40 years).

- **Start** with procyclical leverage:

- We set  $\varepsilon = 0.5$   
(calibrated from Mian and Sufi, 2011).

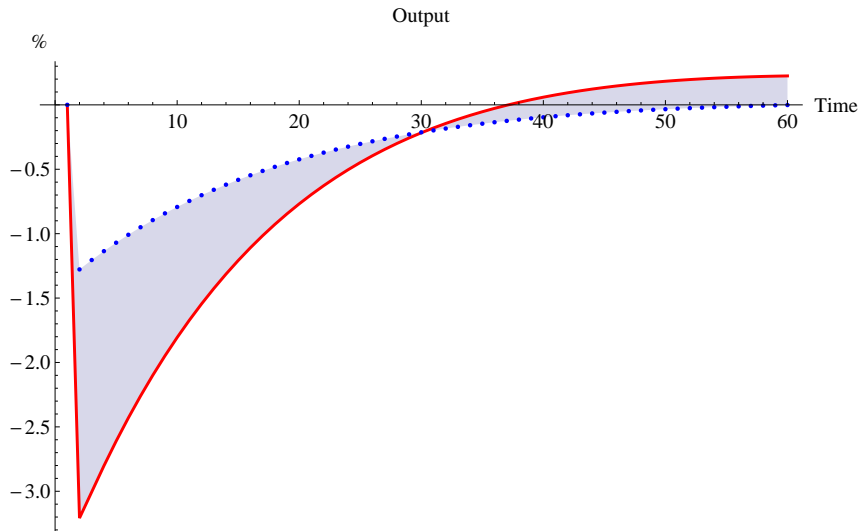
# Impulse responses

## Result:

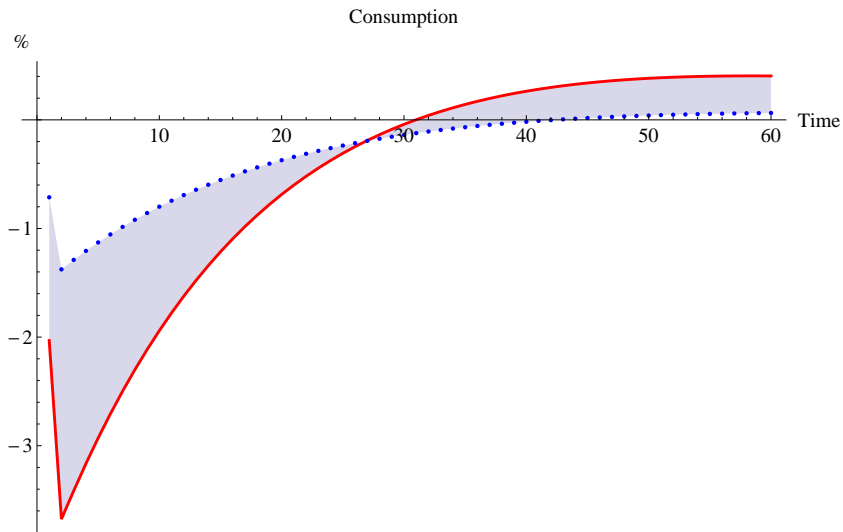
- Negative leverage shock is significantly amplified under learning
  - impact on output and capital is  $2.5\times$  larger,
  - impact on consumption is more than  $3\times$  larger.
- Deleveraging is more severe under learning
  - fall in land price is  $3\times$  larger,
  - debt decrease is multiplied by about 2.5 compared to RE.
- Both capital and output overshoot markedly their long-run levels.
- Magnitudes of output's and consumption's responses roughly match data, investment is too volatile.



# Impulse responses



# Impulse responses



# Countercyclical leverage

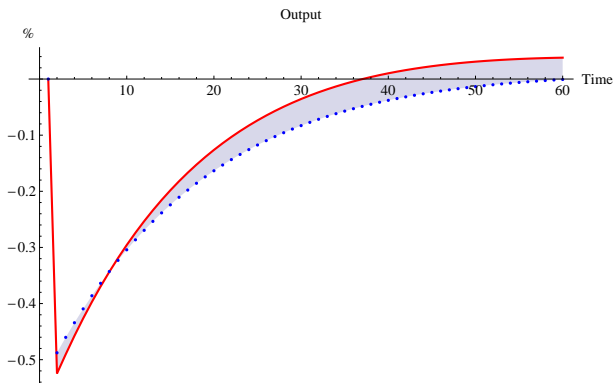
What would be the effect of (macro-prudential) regulation that makes leverage mildly countercyclical ?

- Set  $\varepsilon = -0.5$  (leverage goes down when land price goes up).
- Assume that agents “know” (or has learnt) it:
  - DGP ( $\mathbf{M}^{RE}$ ) and beliefs ( $\mathbf{M}_{2008Q4}$ ) use  $\varepsilon = -0.5$

# Countercyclical leverage

## Result:

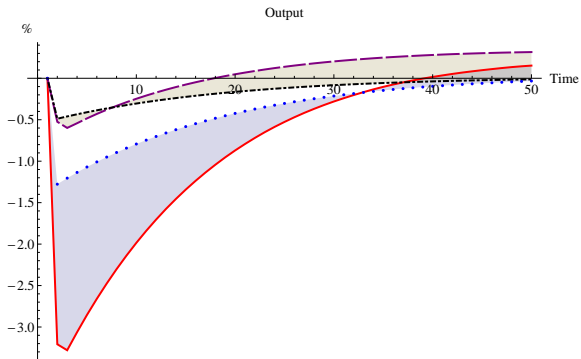
- Countercyclical leverage dampens responses to financial shocks.
- Much smaller recession follows a negative leverage shock item Countercyclical leverage brings learning dynamics closer to its rational expectations counterpart.



# Countercyclical leverage

## Result:

- Countercyclical leverage dampens responses to financial shocks.



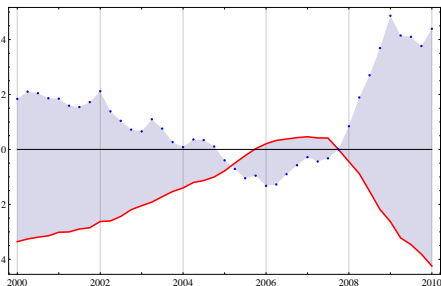
**Figure:** Responses to a negative leverage shocks for a pro-cyclical ( $\varepsilon = 0.5$ ) leverage under learning (solid red) and RE (dotted blue) and for a counter-cyclical ( $\varepsilon = -0.5$ ) leverage under learning (dashed purple) and RE (dashed-dotted black)

# Countercyclical leverage and the Great Recession

## Result:

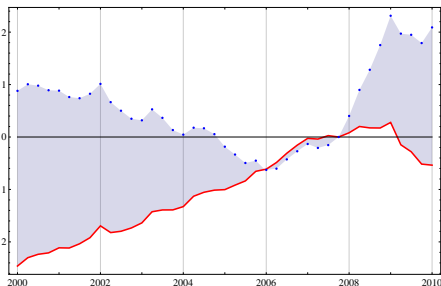
- Countercyclical leverage could avoid Great Recession
- Much smaller recession follows a negative leverage shock

Output Response Over Time (% Deviations From 2007Q4)



(a) Procyclical leverage,  $\varepsilon = 0.5$

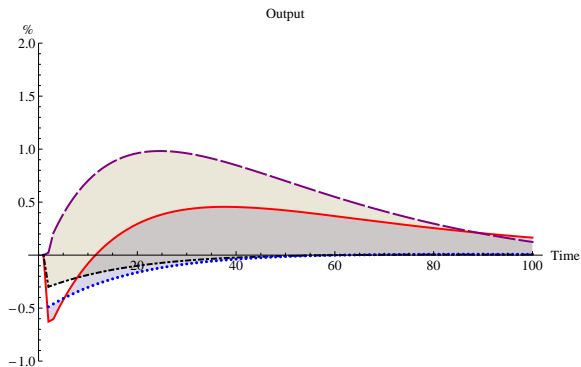
Output (% Deviations From 2007Q4)



(b) Countercyclical leverage,  $\varepsilon = -0.5$

## Perception/expectations about policy

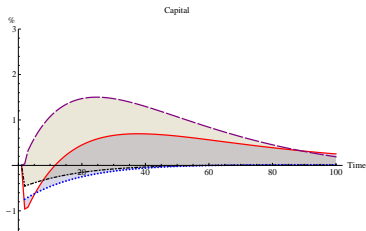
- But what if the change of policy is unannounced / not understood?
- Misperception of macroprudential policy:
  - $M^{RE}$  for  $\epsilon < 0$  but  $M_{2008Q4}$  reflects  $\epsilon > 0$



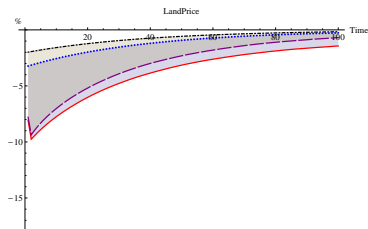
**Figure:** Responses to a negative leverage shocks for mildly counter-cyclical ( $\epsilon = -0.5\%$ ) leverage under learning (solid red) and RE (dotted blue) and strongly counter-cyclical  $\epsilon = -1.5\%$ ) leverage under learning (dashed purple) and RE (dashed-dotted black) given the incorrect beliefs regarding the macro-prudential policy.

# Wrong beliefs

- Dynamics driven by the behavior of capital and not land price



(a) Capital following 5% leverage shock.



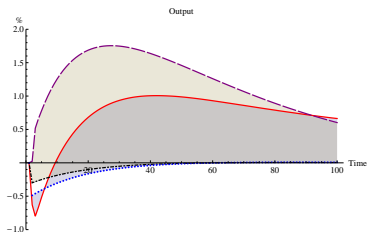
(b) Land price following 5% leverage shock.

Responses to a negative leverage shocks for mildly counter-cyclical ( $\varepsilon = -0.5\%$ ) leverage under learning (solid red) and RE (dotted blue) and strongly counter-cyclical  $\varepsilon = -1.5\%$  leverage under learning (dashed purple) and RE (dashed-dotted black) given the incorrect beliefs regarding the macro-prudential policy.

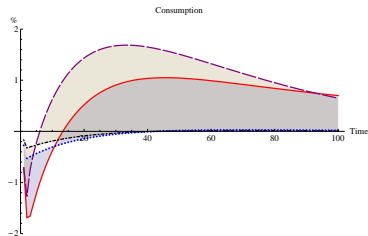


# Confidence

- Reduction of confidence in the policy makes reaction under learning even larger



(a) Output following 5% leverage shock with low initial confidence.



(b) Consumption following 5% leverage shock with low initial confidence.

Responses to a negative leverage shocks for mildly counter-cyclical ( $\varepsilon = -0.5\%$ ) leverage under learning (solid red) and RE (dotted blue) and strongly counter-cyclical  $\varepsilon = -1.5\%$  leverage under learning (dashed purple) and RE (dashed-dotted black) given the incorrect beliefs regarding the macro-prudential policy but with less confidence.

# Conclusion

- Simple model with adaptive learning
- Learning (for the leverage shocks) can act as amplification mechanism under pro-cyclical leverage
- Counter-cyclical leverage can reduce this amplification significantly...
- ...but only if it is expected.
- Eventual policy change designed to reduce volatility can lead to opposite results
  - here it is showed for macro-prudential policy...
  - but it is more general
- Important message for the design and implementation of policy changes