

Zero interest rate policy and asymmetric price adjustment in Japan: an empirical analysis of a nonlinear DSGE model

Hirokuni IIBOSHI

Tokyo Metropolitan University

Mototsugu SHINTANI

University of Tokyo

22nd Computing in Economics and Finance
June 28, 2016, Bordeaux, France

1 Introduction

2 Model and Methods

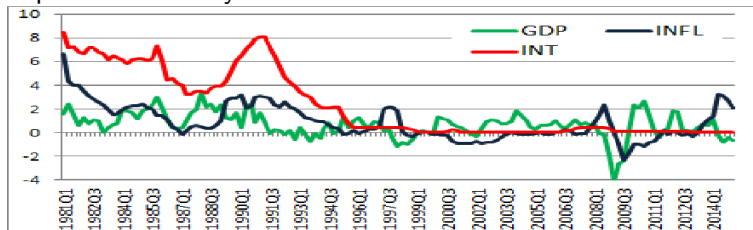
- Model
- Estimation Methods

3 Empirical Results

- Model Selection
- Estimated Parameters
- Policy Functions
- Estimated Shocks and IRFs

4 Conclusion

Japanese Economy



	GDP: y_t		INFL: π_t		INT: r_t	
	mean	Vola	mean	Vola	mean	Vola
before 99:Q1	0.89	0.99	1.64	1.32	4.27	2.54
After 99:Q1	0.40	1.10	-0.01	1.02	0.09	0.14

- Under Zero Interest Rate Policy (After 99:Q1):
Volatility of GDP: Up \uparrow & Volatility of INFL: Down \downarrow

- We apply a non-linear (NL) New Keynesian (NK) DSGE extended
 - to two aspects;
 - ① Zero Lower Bound (ZLB),
 - ② Asymmetric Adjustment Cost (AAC),
 - to Japanese economy for the last thirty years (from 1981Q3 to 2015Q1) including, so called “Bubble boom” and “Lost decade”
 - using (1) *Projection method* and (2) *Particle Filter MH* oriented to a NL approach.

- From Marginal Likelihood, the model with both of ZLB and AAC is selected.
 - Downward rigidity is observed, even Japan faces deflation.
 - The adjustment cost near Zero Interest Rate Policy is 60.8% ($=\exp(0.475)$) higher than *the inflation* period (non ZIRP),
- Estimated Policy Functions of the selected model shows
 - 1 Reactions of Output to TFP shock are steep, and Reactions of Inflation are moderate under ZIRP (low level of TFP shock). Under no ZIRP, *vice versa*.
 - These explain high volatility of GDP and low volatility of Inflation during deflation.
 - 2 Reactions of Inflation to Monetary Policy Shock are moderate under ZIRP (low TFP). Under no ZIRP, Reactions of Inflation are steep.
 - Even positive monetary policy has weak impact on inflation near ZIRP.

- Difference between NL and linear NK DSGE models under zero lower bound (ZLB) was studied by **Fernandez-Villaverde et al. (2015)**.
- In terms of balance between speed and precision, **Richter et al. (2014)** shows a *time iteration method with linear interpolation* (TL) performs best among projection methods to solve NL DSGE models under ZLB.
- **Gust et al. (2013)** estimated a NL NK DSGE under ZLB for US, using particle filter Metropolis-Hastings (PFMH) algorithm (see **Herbst and Schorfheide (2016)**).
- **Aruoba et al. (2014)** and **Aruoba and Schorfhide (2015)** estimated a log-linearized NK DSGE under ZLB for Japan.
- **Kim and Ruge-Murcia (2009)**, **Aruoba and Schorfhide (2015)** estimated downward rigidity for price and wage in USA using AAC.

1 Introduction

2 Model and Methods

- Model
- Estimation Methods

3 Empirical Results

- Model Selection
- Estimated Parameters
- Policy Functions
- Estimated Shocks and IRFs

4 Conclusion

Monetary Policy under ZLB

- Our model is extended from standard NK model by An & Schorfheide (2007). Aruoba et al (2014), Aruoba & Schorfhide (2015) are also based on them.
- Monetary policy rule is constrained by ZLB

$$R_t = \max(1, R_t^*{}^{1-\rho_R} R_{t-1}^{\rho_R} e^{\epsilon_{R,t}}), \quad (1)$$

where R_t is the gross nominal interest rate. $\epsilon_{R,t}$ is monetary policy shock.

- R_t^* is nominal target rate

$$R_t^* = r\pi^* \left(\frac{\pi_t}{\pi^*}\right)^{\psi_1} \left(\frac{Y_t}{Y_t^*}\right)^{\psi_2}, \quad (2)$$

where π^* and Y_t^* is inflation target and output target, respectively.

Asymmetric Adjustment Cost (AAC)

- Cost shifted asymmetrically at threshold, π , is introduced to Rotemberg-type adjustment cost. π is a steady state of inflation.

$$AC_t(j) = \frac{\phi(\pi_t)}{2} \left(\frac{P_t(j)}{P_{t-1}(j)} - \pi \right)^2 Y_t(j), \quad (3)$$

$$\phi(\pi_t) = \begin{cases} \phi_1, & \text{if } \frac{P_t(j)}{P_{t-1}(j)} (= \pi_t) \geq \pi \\ \phi_2 = e^\delta \phi_1, \delta \in (-\infty, \infty), & \text{if } \frac{P_t(j)}{P_{t-1}(j)} (= \pi_t) < \pi \\ \doteq (1 + \delta)\phi_1. & \end{cases},$$

where $\phi(\pi_t)$ is coefficient of the AC, and δ is **fraction of shift of the cost** when $\pi_t < \pi$. $\delta > 0$ means **downward rigidity**.

Asymmetric Adjustment Cost (AAC) (cont'd)

- Kim & Ruge-Marcia (2009), Arouba et al. (2013) used AAC as below (as introduced by Varian, 1974).

$$AC_t(j) = \phi \left(\frac{\exp(-\psi(P(j)_t/P(j)_{t-1} - 1)) + \psi(P(j)_t/P(j)_{t-1} - 1) - 1}{\psi^2} \right), |$$

where $\phi > 0$. if $\psi > 0$, then downward rigidity, and if $\psi < 0$, then upward rigidity.

Firms

Monopolistically competitive intermediate goods producing firms

$$\Pi = E_t \left[\sum_{s=0}^{\infty} \beta^s Q_{t+s|t} \left(\frac{P_{t+s}(j)}{P_t} Y_{t+s}(j) - W_{t+s} N_{t+s}(j) - AC_{t+s}(j) \right) \right],$$

s.t. (demand and product functions)

$$Y_t(j) = \left(\frac{P_t(j)}{P_t} \right)^{-1/\nu} Y_t,$$

$$Y_t(j) = A_t N_t(j),$$

where β is discount factor. ν is inverse elasticity of demand for goods j . A_t and $N_t(j)$ are exogenous common productivity process and the labor input of firm j , respectively.

Households

$$U = E_t \left[\sum_{s=0}^{\infty} \beta^s \left(\frac{(C_{t+s}/A_{t+s})^{1-\tau} - 1}{1-\tau} + \chi_M \ln \left(\frac{M_{t+s}}{P_{t+s}} \right) - \chi_H H_{t+s} \right) \right],$$

s.t. (budget constraint)

$$P_t C_t + B_t + M_t + T_t = P_t W_t H_t + R_{t-1} B_{t-1} + M_{t-1} + P_t D_t + P_t S C_t,$$

where τ is inverse elasticity of intertemporal substitution of consumption.

Government

The government's budget constraint and expenditure

$$P_t G_t + R_{t-1} B_{t-1} + M_{t-1} = T_t + B_t + M_t,$$

$$G_t = \left(1 - \frac{1}{g_t} \right) Y_t. \quad (4)$$

- Aggregate productivity evolves as nonstationary process

$$A_t = \gamma A_{t-1} z_t, \quad z_t = z_{t-1}^{\rho_z} e^{\epsilon_{z,t}} (> 0), \quad (5)$$

where γ stands for average technology growth rate, z_t is the exogenous fluctuation of the technology growth rate and $\epsilon_{z,t}$ is the productivity shock.

- The fraction of government to aggregate output

$$g_t/g = (g_{t-1}/g)^{\rho_g} e^{\epsilon_{g,t}} (> 0), \quad (6)$$

where $\epsilon_{g,t}$ is government shock.

- The steady state

$$\begin{aligned}\pi &= \pi^*, \quad r = \frac{\gamma}{\beta}, \quad R = r\pi^*, \\ C/A &= (1 - \nu)^{1/\tau}, \quad Y/A = g C/A = Y^*/A.\end{aligned}$$

Because technology $\ln A_t$ evolves based on a random walk with drift $\ln \gamma$, consumption and output are detrended to obtain a steady state.

- The potential aggregate output

$$Y_t^* = (1 - \nu)^{1/\tau} A_t g_t, \quad (7)$$

- The market clearing conditions

$$Y_t = C_t + G_t + AC_t, \quad N_t = H_t, \quad (8)$$

- Households:

$$1 = \beta E_t \left[\left(\frac{C_{t+1}/A_{t+1}}{C_t/A_t} \right)^{-\tau} \frac{A_t}{A_{t+1}} \frac{R_t}{2\nu} \right] \quad (9)$$

- Intermediate Firms:

$$\begin{aligned} 1 &= \phi(\pi_t) (\pi_t - \pi) \left[\left(1 - \frac{1}{2\nu} \right) \pi_t + \frac{\pi}{\pi_{t+1}} \right] \\ &- \beta E_t \left[\phi(\pi_{t+1}) \left(\frac{C_{t+1}/A_{t+1}}{C_t/A_t} \right)^{-\tau} \frac{Y_{t+1}/A_{t+1}}{Y_t/A_t} (\pi_{t+1} - \pi) \pi_{t+1} \right] \\ &+ \frac{1}{\nu} \left[1 - \left(\frac{C_t}{A_t} \right)^\tau \right]. \end{aligned} \quad (10)$$

The sizes of $\phi(\pi_t)$ and $\phi(E_t(\pi_{t+1}))$ depend on current inflation, π_t , and expected inflation, $E_t(\pi_{t+1})$, respectively.

1 Introduction

2 Model and Methods

- Model
- Estimation Methods

3 Empirical Results

- Model Selection
- Estimated Parameters
- Policy Functions
- Estimated Shocks and IRFs

4 Conclusion

Variation of Estimated Models

- We examine and estimate four models classified with respect to the two assumptions.
 - Model 1: in absence of the ZLB and the AAC
 - Model 2: in presence of the ZLB
 - Model 3: in presence of the AAC
 - Model 4: in presence of both the ZLB and the AAC

Two Steps of MCMC of Bayesian Inference.

- ① Calculation of Policy Functions: a *Time Iteration method with Linear Interpolation* (TL)
 - In terms of balance between speed and precision, **Richter et al. (2014)** shows TL performs best among projection methods to solve NL DSGE models under ZLB.
- ② Estimation of Parameters: *Particle Filter MH algorithm* (Herbst & Schorfheide, 2015)
 - adopt 10,000 particles to calculate likelihood approximation using particle filter.
 - select the mode of posterior density out of parameters sampled from prior distribution.
 - obtain 25,000 draws of MCMC samplings after discarding the first 5,000 burn-in draws.

Time Iteration with Linear Interpolation (TL)

- The model's decision rules (or policy functions)

$$Y_t/A_t = \mathcal{P}_\dagger \left(\underbrace{R_{t-1}, g_t, z_t}_{3 \text{ State Var}}, \underbrace{\varepsilon_{R,t}}_{1 \text{ Shock}} \right), \quad (11)$$

$$\pi_t = \mathcal{P} \left(R_{t-1}, g_t, z_t, \varepsilon_{R,t} \right),$$

where Y_t/A_t , π_t , are control variables and R_{t-1} , g_t , z_t , and $\varepsilon_{R,t}$ are state variables or shocks.

- # of policy functions (11) = # of optimal conditions; (9) and (10)
- # of nodes.
 - 1715(= $7 \times 7 \times 7 \times 5$) nodes,
because 7 grid points on 3 state variables and 5 on 1 shock.

State Space Form

- State Equations

The policy functions, Eq.(11), with Eq. (1), (5) and (6),

$$s_t = \Phi(s_{t-1}, \varepsilon_t, \theta), \quad (12)$$

where s_t is endogenous variables θ is the parameters.

- Measurement Equations

$$y_t = \psi(s_t, \theta) + \sigma_u u_t, \text{ for } u_t \sim \text{i.i.d. } N(0, I)$$

$$\begin{bmatrix} YGR_t \\ INFL_t \\ INT_t \end{bmatrix} = \begin{bmatrix} 100 \times (\ln(Y_t/A_t) - \ln(Y_{t-1}/A_{t-1}) + \ln z_t + \ln \gamma) \\ 400 \times \ln \pi_t \\ 400 \times \ln R_t \end{bmatrix} + \begin{bmatrix} \sigma_{\Delta y} u_{y,t} \\ \sigma_{\pi} u_{\pi,t} \\ \sigma_r u_{r,t} \end{bmatrix}. \quad (13)$$

where y_t is observed variables, σ_u and u_t are standard deviation and disturbance term of the measurement error.

Data and Sample Period

Japan data on output growth (Δy_t), inflation (π_t), and nominal interest rate rates (R_t) **from 1985:Q3 through 2015:Q1**.

- real GDP figures from the Cabinet Office's National Accounts. release of benchmark year 2005 that cover the period 1994Q1-2015Q1. To extend, from the benchmark year 2000 release and spanned the period 1985Q3-2015Q1.
- For the price level, core CPI
- The nominal interest rate, the Bank of Japan's uncollateralized call rate and transformed monthly figures to quarterly averages over the sample period.

Prior Setting

parameters	definition	distribution	parameter 1	parameter 2
β	discount factor	beta	0.98	0.01
τ	inverse elasticity of substitution	gamma	2.0	0.1
ν	inverse elasticity of demand for goods	gamma	0.3	0.1
ϕ_2	coef. of adjustment costs	gamma	20.0	10.0
δ	Degree of asymmetric AC	beta	0.25	0.1
ψ_1	reaction of inflation	normal	1.5	0.5
ψ_2	reaction of output	normal	0.5	0.5
γ	average technology growth rate	normal	1.04	0.01
π	Steady state inflation rate	normal	1.0	0.01
ρ_r	persistence of MP shock	beta	0.75	0.1
ρ_g	persistence of Gov shock	beta	0.75	0.1
ρ_z	persistence of TFP shock	beta	0.75	0.1
σ_r	St.D. of MP iid shock	Inverse gamma	0.5	5
σ_g	St.D. of Gov iid shock	Inverse gamma	0.5	5
σ_z	St.D. of TFP iid shock	Inverse gamma	0.5	5

1 Introduction

2 Model and Methods

- Model
- Estimation Methods

3 Empirical Results

- **Model Selection**
- Estimated Parameters
- Policy Functions
- Estimated Shocks and IRFs

4 Conclusion

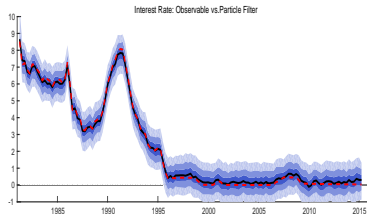
	ZLB	AAC	Log Marginal Likelihood	Posterior Model Prob
Model 1	No	No	-966.75	0.0000
Model 2	Yes	No	-789.14	0.0004
Model 3	No	Yes	-957.11	0.0000
Model 4	Yes	Yes	-781.38	0.9996

Notes: ZLB and AAC stand for zero lower bound and asymmetric adjustment cost, respectively.

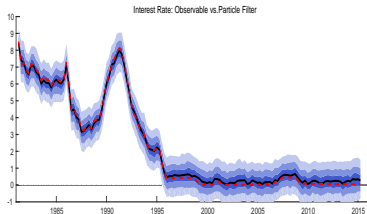
Posterior Estimates of Interest Rate

Actual: Red dashed line, Estimated: Black solid line, 68% bands: Blue shade area

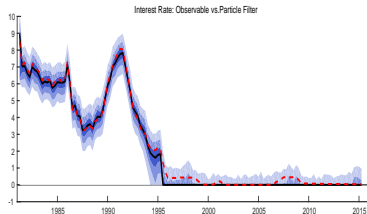
None (Model 1)



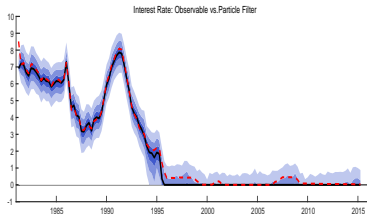
AAC (Model 3)



ZLB (Model 2)



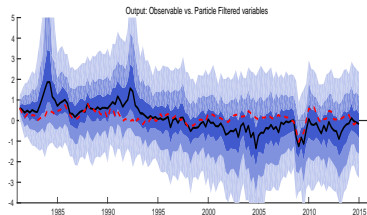
ZLB&AAC (Model 4)



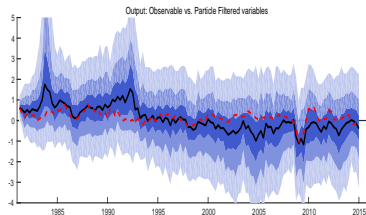
Posterior Estimates of Real GDP

Actual: Red dashed line, Estimated: Black solid line, 68% bands: Blue shade area

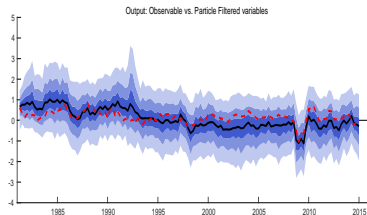
None (Model 1)



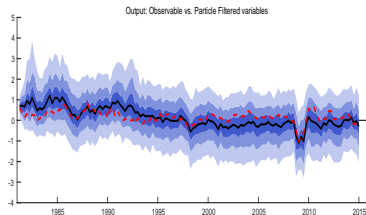
AAC (Model 3)



ZLB (Model 2)



ZLB&AAC (Model 4)



1 Introduction

2 Model and Methods

- Model
- Estimation Methods

3 Empirical Results

- Model Selection
- **Estimated Parameters**
- Policy Functions
- Estimated Shocks and IRFs

4 Conclusion

Estimated Parameters

$\delta = 0.475 > 0$ and $\exp(0.475) = 1.608$ indicates that

- Downward rigidity is observed, even Japan faces deflation.
- The adjustment cost near ZIRP is 60.8% higher than *the inflation* period (non ZIRP),

parameters		Model 1	Model 2	Model 3	Model 4
ZLB		No	Yes	No	Yes
AAC		No	No	Yes	Yes
β	discount factor	0.994	0.995	0.995	0.995
τ	inverse elasticity of substitution	1.755	1.566	1.819	1.617
ν	inverse elasticity of demand for goods	0.423	0.562	0.418	0.494
ϕ_1	coef. of adjustment costs	16.85	16.74	16.91	16.97
δ	Degree of asymmetric AC	N.A.	N.A.	-0.058	0.475
ψ_1	reaction of inflation	1.60	1.67	1.61	1.66
ψ_2	reaction of output	0.61	0.63	0.60	0.58
γ	average technology growth rate	1.0048	1.0005	1.0056	1.0003
π	Steady state inflation rate	1.0017	1.0034	1.0024	1.0017

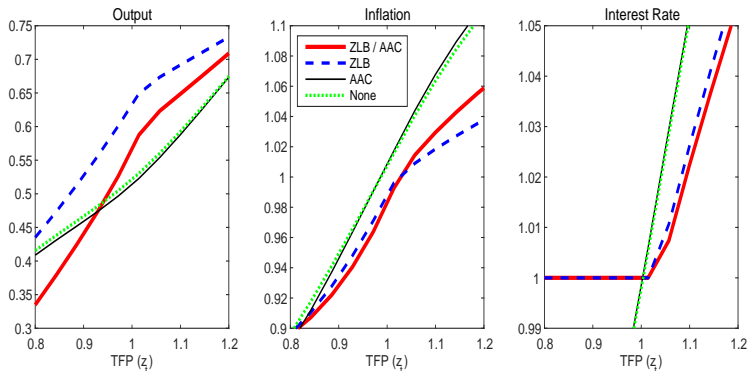
Estimated Parameters (cont'd)

parameters		Model 1	Model 2	Model 3	Model 4
ZLB		No	Yes	No	Yes
AAC		No	No	Yes	Yes
ρ_r	persistence of MP shock	0.657	0.635	0.667	0.689
ρ_g	persistence of Gov shock	0.639	0.837	0.644	0.838
ρ_z	persistence of TFP shock	0.851	0.768	0.857	0.791
σ_r	St.D. of MP iid shock	1.538	0.921	1.478	0.872
σ_g	St.D. of Gov iid shock	0.731	1.765	0.681	1.744
σ_z	St.D. of TFP iid shock	1.565	0.768	1.506	0.781
$\sigma_{\Delta y}$	St.D. of measument error of output	0.552	0.576	0.573	0.571
σ_{π}	St.D. of measument error of inflation	0.882	0.861	0.874	0.851
σ_R	St.D. of measument error of R	1.241	1.242	1.259	1.241

- 1 Introduction
- 2 Model and Methods
 - Model
 - Estimation Methods
- 3 Empirical Results
 - Model Selection
 - Estimated Parameters
 - **Policy Functions**
 - Estimated Shocks and IRFs
- 4 Conclusion

Posterior Estimation of PFs for TFP Shock

- Reactions of Output to TFP shock are steep, and Reactions of Inflation are moderate under ZIRP (low level of TFP shock). Under no ZIRP, *vice versa*.
 - These explain high volatility of GDP and low volatility of Inflation during deflation.

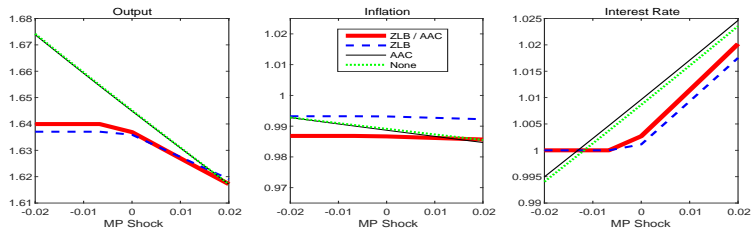


Notes: The PFs are calculated from the posterior means of parameters.
We fix as $Gov_t = 1.7$, $R_{t-1} = 1.01$, $MP_t = 0$.

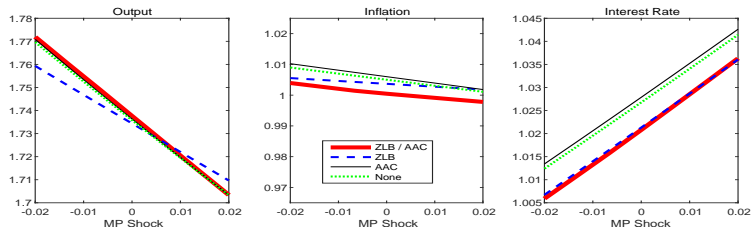
Posterior Estimation of PFs for MP Shock

- Reactions of Inflation to Monetary Policy Shock are moderate under ZIRP (low TFP). Under no ZIRP, the Reactions of Inflation are steep.

(a) Around ZIRP (small TFP) $TFP_t = 0.97$, $Gov_t = 2.6$, $R_{t-1} = 1.03$

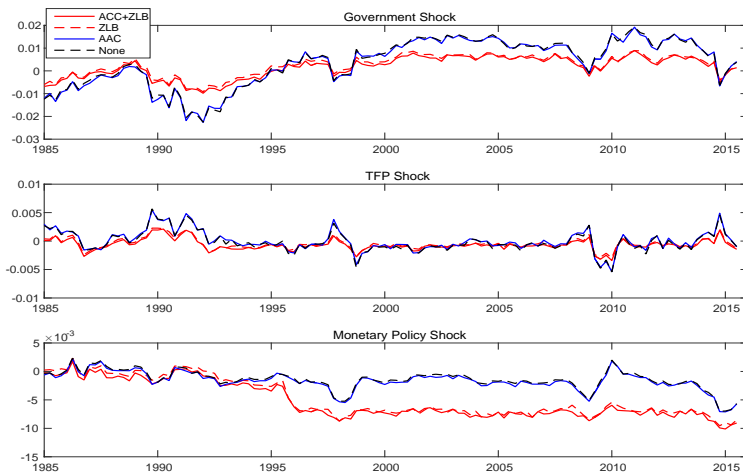


(b) Far from ZIRP (large TFP) $TFP_t = 1.01$, $Gov_t = 2.6$, $R_{t-1} = 1.03$



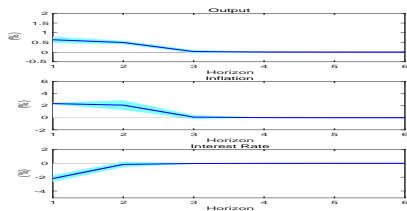
- 1 Introduction
- 2 Model and Methods
 - Model
 - Estimation Methods
- 3 Empirical Results
 - Model Selection
 - Estimated Parameters
 - Policy Functions
 - Estimated Shocks and IRFs
- 4 Conclusion

Posterior Estimates of Exogenous Shocks

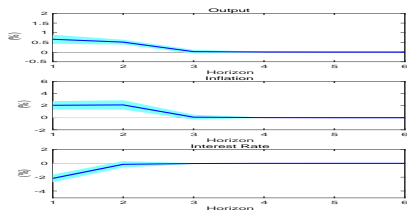


IRF of Negative Monetary Policy Shock

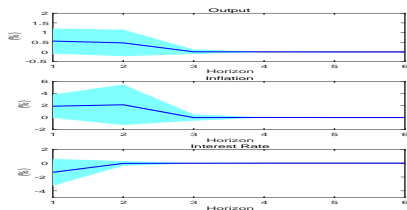
(a) None



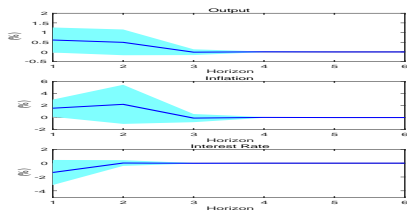
(c) AAC



(b) ZLB



(d) ZLB & AAC



- From Marginal Likelihood, the model with both of ZLB and AAC is selected.
 - Downward rigidity is observed, even Japan faces deflation.
 - The adjustment cost near Zero Interest Rate Policy is 60.8% ($=\exp(0.475)$) higher than *the inflation* period (non ZIRP),
- Estimated Policy Functions of the selected model shows
 - 1 Reactions of Output to TFP shock are steep, and Reactions of Inflation are moderate under ZIRP (low level of TFP shock). Under no ZIRP, *vice versa*.
 - These explain high volatility of GDP and low volatility of Inflation during deflation.
 - 2 Reactions of Inflation to Monetary Policy Shock are moderate under ZIRP (low TFP). Under no ZIRP, Reactions of Inflation are steep.
 - Even positive monetary policy has weak impact on inflation near ZIRP.