## Appendix: the Great Moderation in the Japanese Economy

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# **Omitted Variables**

## **Omitted Variables**

## Capital?

- Gali (1999)
- assumption: Stationary Capital output ratio

## Other Variables (Shocks)?

- IST shocks, Monetary shock, and so on
- Future work

# Equilibrium

## Self-Confirming Equiibrium 1)

- Fudenberg and Levine (1993), Cho and Sargent (2006), Sargent (2008)
- interactions among a collection of adaptive agents, each of whom averages past data to approximate moments of the conditional probability distns
- If outcome converge, a Law of Large Numbers implies agents' beliefs about conditional moments become correct on events that are infrequently observed.
- Beleifs are not necessarily correct about events that are infrequently oberved.
- Where beliefs are correct, a self-confirming equilibrium is like a rational expectations equilibrium.

## Self-Confirming Equiibrium 2)

- Agent *i* with strategy space  $A_i$  and state space  $X_i$ .
- Probability distn P<sub>i</sub> over A<sub>i</sub> × X<sub>i</sub>: how actions and states are related.
- utility fcn is  $u_i : A_i \times X_i \to R$
- μ<sub>i</sub>(: a<sub>i</sub>): a probability distn over X<sub>i</sub> represent i's belief about the state conditional on action a<sub>i</sub>.
- Agent i's decision problem is to solve

$$\max_{a_i \in A_i} \int_{x_i} u_i(a_i, x_i) d\mu_i(x_i : a_i).$$
(1)



# Priors



## **Priors**

# • 18 Models

# Robost Results

## Priors 1)

• the conditional prior density of  $\theta^T$  is given by

$$p(\theta^T | \alpha^T, h^T, Q, \Psi, \Xi) \propto I(\theta^T) f(\theta^T | \alpha^T, h^T, Q, \Psi, \Xi),$$

## • $z^T$ : a sequence of z's up to time T.

• 
$$I(\theta^T) = \prod_{t=0}^T I(\theta_t),$$

- $f(\theta^T | \alpha^T, h^T, Q, \Psi, \Xi) = f(\theta_0) \Pi_{t-1}^T f(\theta_t | \theta_{t-1}, \alpha^T, h^T, Q, \Psi, \Xi)$
- $I(\theta^T)$  takes a unit value if all the roots of the VAR polynomial associated with  $\theta_t$ are larger than one in modulus and 0 otherwise,

ruling out a non-stationary process.

## **Priors 2) distributions**

 Following Cogley and Sargent (2005) and Gali and Gambetti (2009), prior distributions and its hyperparameters :

$$p(\theta_0) \propto I(\theta_0) N(\hat{\theta}_{OLS}, \hat{V}(\hat{\theta}_{OLS}))$$
$$p(\log h_0) = N(\log \hat{h}_{OLS}, 10 \times I)$$
$$p(\alpha_0) = N(\hat{\alpha}_{OLS}, |\hat{\alpha}_{OLS}|)$$

$$p(Q) = IW(\overline{Q}^{-1}, T_0)$$
$$p(\Xi_{i,i}) = IG\left(\frac{\overline{\Xi}}{2}, \frac{1}{2}\right)$$
$$p(\Psi) = IW(\overline{\Psi}^{-1}, 2).$$

## not flat but uninformative

Ko and Murase (2010)

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## **Priors 3) values**

- $\hat{\theta}_{OLS}$ : OLS estimates of VAR coefficients.
- $\hat{V}(\hat{\theta}_{OLS})$ : the estimate of their covariance matrix.
- $\hat{h}_{OLS}$ : vector containing elements of the diagonal matrix  $\hat{H}$ .
- $\hat{\alpha}_{OLS}$ : the element (2,1) of the lower triangular matrix  $\hat{A}$ .
- $\bar{Q} = k_Q \times \hat{V}(\hat{\theta}_{OLS}).$
- *T*<sub>0</sub>: # of observations in the initial sample.
- $\overline{\Xi} = k_{\xi}$ .
- $\overline{\Psi} = \mathbf{k}_{\Psi} \times |\hat{\alpha}_{OLS}|.$
- Benchmark:  $k_Q = 0.005$ ,  $k_{\xi} = 0.0001$ ,  $k_{\Psi} = 0.001$ .

## Priors 4) robustness

- 18 models
- $k_Q = \{0.005, 0.001, 0.1\}.$
- $k_{\xi} = \{0.0001, 0.001\}.$
- $k_{\Psi} = \{0.001, 0.01, 1\}.$
- Robust in all cases!!!

# Estimation

## **Estimation**

- We use a Markov Chain Monte Calro (MCMC) method, the Gibbs sampling .
  - The Gibbs sampler partitions the vector of unknowns into blocks.
  - The transition density is defined by the product of conditional densities.

#### Step 1

# **Step 1:** $p(\theta^T | x^T, \alpha^T, h^T, Q, \Psi, \Xi)$

- Conditional on x<sup>T</sup>, α<sup>T</sup>, h<sup>T</sup>, Q, Ψ, Ξ, the unrestricted posterior of the states is normal.
- To draw from the conditional posterior, we employ the algorithm of Carter and Kohn (1994).
- The conditional mean and variance of the terminal state  $\theta_T$  is computed using standard Kalman filter recursions.
- For all the other states, the following backward recursions are employed:

$$\theta_{t|t+1} = \theta_{t|t} + P_{t|t} P_{t|t+1}^{-1} (\theta_{t+1} - \theta_{t|t}),$$
(2)

$$P_{t|t+1} = P_{t|t} - P_{t|t} P_{t+1|t}^{-1} P_{t|t}, \qquad (3)$$

where  $p(\theta^T | x^T, \alpha^T, h^T, Q, \Psi, \Xi) \sim N(\theta_{t|t+1}, P_{t|t+1})$ .

# **Step 2:** $p(\alpha^T | x^T, \theta^T, h^T, Q, \Psi, \Xi)$

- Conditional on  $\theta^T$ ,  $\hat{y}_t = x_t - \beta_{0,t} - \beta_{1,t} x_{t-1} - \dots - \beta_{p,t} x_{t-p}$  is observable.
- We can rewrite our system of equations as  $A_t \hat{y}_t = H_t v_t$ , where  $v_t \sim N(0, I)$ .
- Conditional on h<sup>T</sup>, we use the algorithm of Carter and Kohn (1994) to obtain a draw for α<sub>t</sub> taking the above system as observational equations and unobserved states equations.
- Given that the α<sub>t</sub> and the ν<sub>t</sub> are independent across equations, the algorithm can be applied equation by equation.



Step 3

# **Step 3:** $p(h^T | x^T, \theta^T, \alpha^T, Q, \Psi, \Xi)$

 This is done by using the univariate algorithm by Jacquier et al. (1994). Step 4:  $p(\Psi|x^T, \theta^T, \alpha^T, h^T, Q, \Xi)$ ,  $p(\Xi_{i,i}|x^T, \theta^T, \alpha^T, h^T, Q, \Psi)$ ,  $p(Q|x^T, \theta^T, \alpha^T, h^T, \Psi, \Xi)$ 

 Conditional on x<sup>T</sup>, θ<sup>T</sup>, α<sup>T</sup>, h<sup>T</sup>, all the remaining hyperparameters, under conjugate priors, can be sampled in a standard way from Inverted Wishart and Inverted Gamma densities.





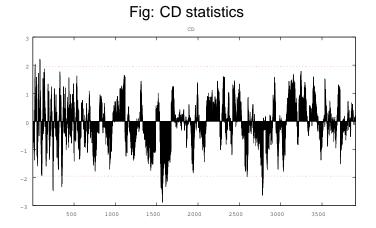
# • Geweke (1992)

# Convergence Diagnotics (CD)

Ko and Murase (2010)

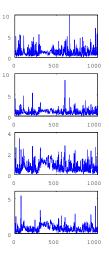
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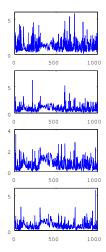
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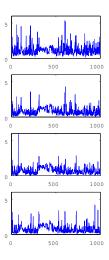


Cannot reject the null hypothesis in most cases

## Fig: Draws and Means of posterior $\log h_t$

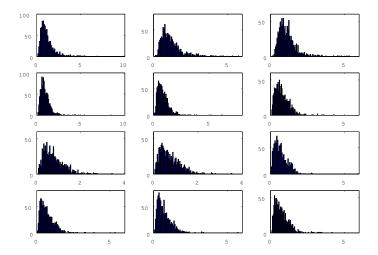






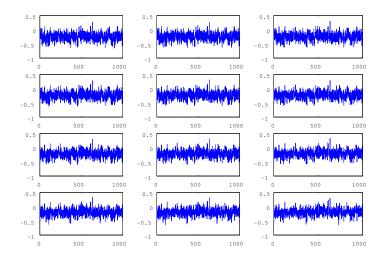
### stationary distn

## Fig: Density of Posterior $\log h_t$



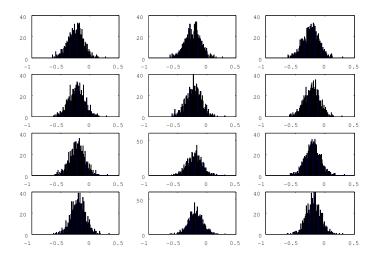
### stationary distn

### Fig: Draws and Means of posterior $\beta_{1,t}$



### stationary distn

### Fig: Density of Posterior $\beta_{1,t}$



### stationary distn

# Government and labor

## **Labor Market Dynamics**

- Employment Protection by Case Laws (Kaiko Kisei)
  - employers must meet four conditions before they fire an employee.
  - 2 Kawaguchi and Murao (2009)
- Life-time employment system
  - Endo and Hirakata (2010)
  - 2 still survives
- Labor Standard Law (Jitan )
  - Mawaguchi and Tsuru (2010): endogenous working hours ↓.
  - 2 Kuroda (2010): No effect on large firms
- Worker Dispatching Act (Roudou Haken Hou)
  - 1986, 1999, 2004

## Taxes

- Gali (2003), Uhlig (2004)
  - Capital tax: included in productivity shocks

## Suppose

- prod. fcn: Y = F(K, AN)
- lemma Homo. of degree 1:  $\frac{Y}{N} = AF(k, 1)$ where  $k \equiv (K/AN)$ : the ratio of capital to labor

(1 – 
$$\tau$$
) $F_k(k, 1) = const.$  hold along a B.G.P.

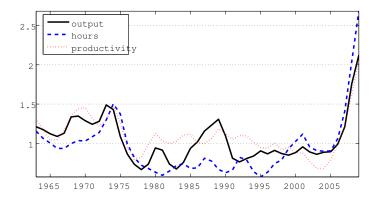
• stationary  $\tau$  may be unwarranted.

## But, at least

- theory:  $\tau \uparrow \rightarrow lp \Downarrow N \uparrow$
- **2** our result (IR):  $lp \uparrow N \uparrow$

# Phases

## **Unconditional SDs**

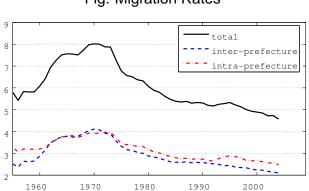


### • 5 Phases

## **Five Phases**

- 5 distint Phases in our economy
- Ist Phase: Until Mid-1970s
  - participation of Baby-boomers
  - geographical and sectoral movement
- 2nd Phase: Mid-1970s to Late-1980s
  - Very stable economy (GM period)
- 3rd Phase: Late-1980s to Early-1990s
  - Bubble periods
  - volatile output while stable labor input and productivity
  - olisappearence of negative correlation

#### Phases

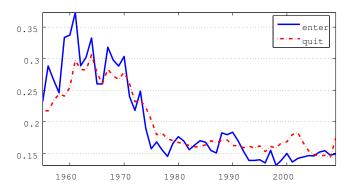


## Fig: Migration Rates

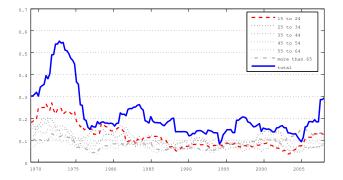
upper trend in the 1st Phase

#### Phases

### Fig: Turnover Rates



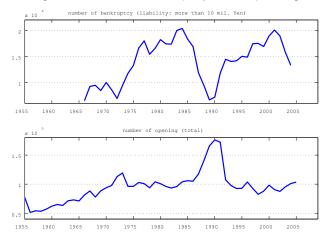
### volatile in the 1st Phase



### Fig: SD of employment rate among ages

- main role of 15-24 in the 1st Phase
- consistent with Jaimovichi and Siu (2009)

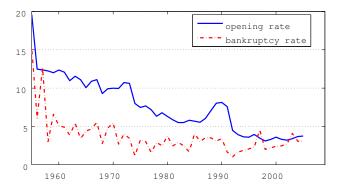
### Fig: Number of Bankruptcy and Opening



### different feature in the 3rd Phase

#### Phases

### Fig: Rates of Bankruptcy and Opening





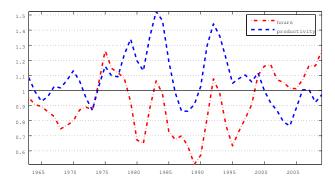
## **Five Phases**

## • 4th Phase: Early-1990s to Mid-2000s

- stable output (GM period)
- Iabor input <sup>↑</sup>
- Iabor productivity U
- 5th: Late-2009s
  - Global crisis
  - all volatile

#### Phases

### Fig: Relative SDs



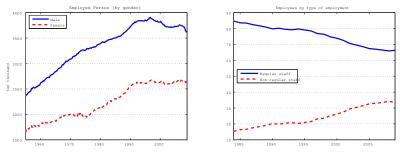
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Phases

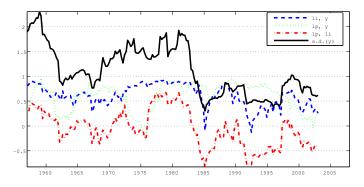
# Fig: Employed Person (by gender) and Employees (by type of employment)



- Participation Rate: Male ↑ until 1975, Female ↑ from 1975
- Saito (2003): home production: husband ↓ → wife ↑
- Gaston and Kishi (2007): long time working by part-time workers

# Comparison with the U.S.

### Fig: Rolling Correlations of the U.S.



- procyclical movement of productivity under NT shocks
- sign changes of correlation btw li and lp

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# **Relationship with theory**

Relationship with labor hoarding models

- Disutility from work depends on employment (n), hours (h), and effort (e): v(n<sub>t</sub>, h<sub>t</sub>, e<sub>t</sub>) ≡ n<sub>t</sub>( λ<sub>h</sub>/(1+η<sub>h</sub> h<sub>t</sub><sup>1+η<sub>h</sub></sup> + λ<sub>e</sub>/(1+η<sub>e</sub> e<sub>t</sub><sup>1+η<sub>e</sub></sup>)
   y<sub>t</sub> = a<sub>t</sub>n<sub>t</sub>(h<sub>t</sub>e<sub>t</sub>)<sup>α</sup> = a<sub>t</sub>n<sub>t</sub>h<sub>t</sub><sup>φ</sup> where φ = α(1 + η<sub>h</sub>/(1+η<sub>e</sub>)).
- U.S. with the labor-search model
  - Itring cost ↓.
  - Substitution from  $e_t$  to  $n_t$  and  $h_t$ .

## **Hours and Employment**

- Negative Correlations of Ip and Ii in all periods (Contributed by NT shocks)
- the labor-search model: Not Our Story in Japan

