

# Monetary Policy and Labor Income Risk with a Billion Observations

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Disclaimer: The views expressed are those of the authors and do not represent the views of the Central Bank of Chile or its board members.

# Introduction

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# Motivation: Monetary Policy and Labor Income Risk

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- Growing literature on how policy interacts with worker heterogeneity  
e.g., Kaplan-Moll-Violante (18), Holm et al. (21), Leahy-Thapar (22), McKay-Wolf (23), Patterson (23)
- Most of this literature focuses on response of **income levels** to shocks
- Large literature on how workers' risk varies over the business cycle  
e.g., Storesletten-Telmer-Yaron (01), Guvenen-Ozkan-Song (14), McKay (17), Bayer et al. (19), Catherine (21)
- Little on the response of the distribution of **income changes** to **aggregate shocks**

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## **This paper: how does income risk respond to monetary shocks?**

- Does it affect overall dispersion (second moment) or downside risk (third moment)?
- What is the labor market flow that drives income risk (e.g., JtU, JtJ, etc.)

### Use high-frequency administrative panel income data for formal workers

- Build monthly moments of the labor income annual growth distribution
- Study the response of these moments to monetary policy shocks
- Study responses conditional on labor market flows (JU, UJ, JTJ, Stayers)

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## We find

- Skewness of labor earnings growth declines after contractionary monetary policy shock
- Dispersion does not respond to monetary shocks
- The skewness of all (most relevant) labor market flows fall in response to monetary policy  
→ **Unemployment risk is not the only source of labor income risk!**

# **Aggregates and Income Risk**

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## Data from unemployment insurance fund (AFC)

- Employer-employee monthly panel: wages, U insurance, firm identifier, education, gender, industry
- Formal workers in private sector; about 1 billion obs from 2002m1-2022m12  
(Do not consider self-employment income)
- Data reported by firms each month, little misreporting, no attrition, low share top coded ( $\approx 2.7\%$ )

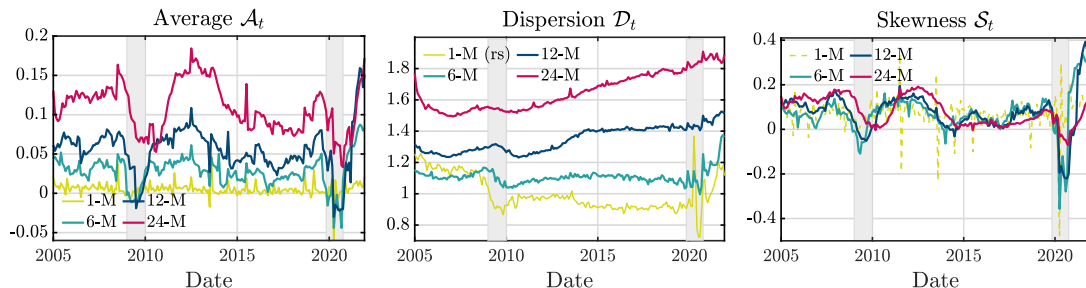
## Variables

- Labor income from main employer and CPI deflated
- Measure log-change of real earnings  $\Delta^h y_{i,t} = y_{i,t} - y_{i,t-h}$  where  $h \in \{1, 6, 12, 24\}$
- We account for zeros and income below min wage according to Guvenen et al. (2021, WP):
  - ★ If  $y_{it} < y_t^{min}$  we set  $y_{it} \approx y_t^{min} + \Delta$
  - ★ Preserves the ranking between workers and the information from JtU and UtJ

► Accounting for zeros



# Moments Over the Business Cycle



Note: gray bars indicate recessions measured as more than three consecutive month with negative y-o-y GDP growth. These are 2009m1-2009m10 and 2020m3-2020m10

- **Average:** **procyclical**
- **Dispersion:** ( $\mathcal{D}_t = \mathcal{P}_{90t} - \mathcal{P}_{10t}$ ) is **acyclical**
- **Skewness** ( $\mathcal{S}_t = \frac{(\mathcal{P}_{90t} - \mathcal{P}_{50t}) - (\mathcal{P}_{50t} - \mathcal{P}_{10t})}{\mathcal{P}_{90t} - \mathcal{P}_{10t}}$ ) is **procyclical** → **Risk:** **countercyclical**

# Monetary Shocks and Income Risk

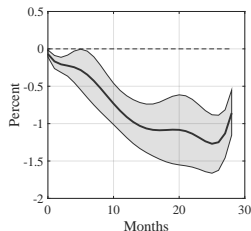
## (Smooth) Local Projections:

$$y_{t+k} - y_t = c + \beta^k \textcolor{red}{mps}_t + \Gamma' X_t + \delta_t + \varepsilon_{kt},$$

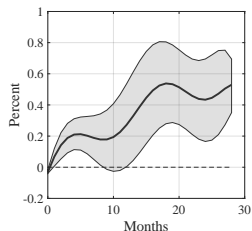
- $y_{t+k}$ : macro variables (check) and moments of **12-month changes**
- **Monetary Shock:**  $\textcolor{red}{mps}_t$ . Daily difference btw effective MPR and Bloomberg expectations (Gonzalez and Tadla, 2018, Aruoba et al, 2022) [► Shocks](#)
- **Controls:** 14 lags of: MPR, inflation, output, Terms of Trade index, and nominal exchange rate, lagged moments
- Sample: 2005m1-2019m12
- Report the Smooth LP (Barnichon and Brownlees, 2019) and the 90% confidence interval

# Monetary Shocks on Aggregates

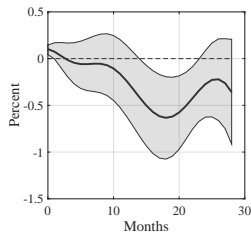
(a) Output



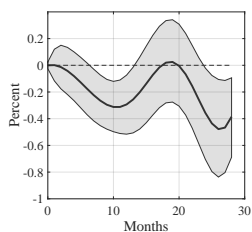
(b) Unemployment



(c) CPI



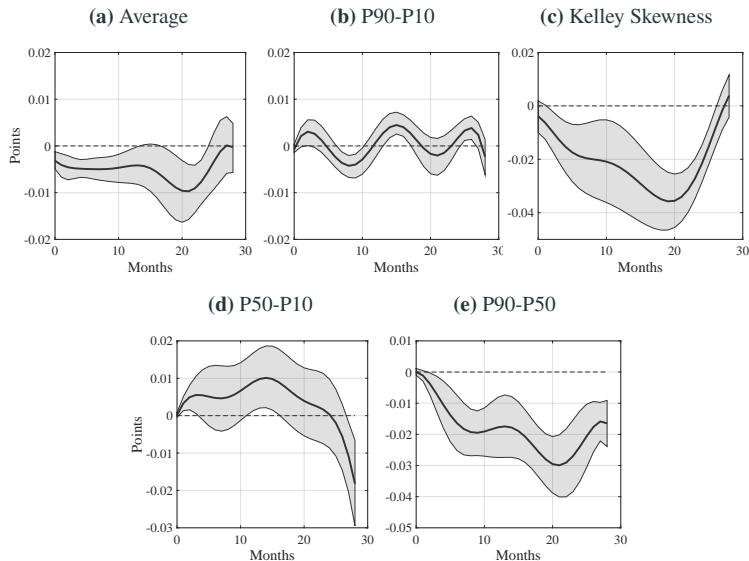
(d) Real Wage



## Aggregate responses to 25bp increase

- Output ↓
- Unemployment ↑
- CPI ↓
- Real Wages ↓

# Monetary Shocks on 12M Changes Distribution



## Moments to 25bp increase

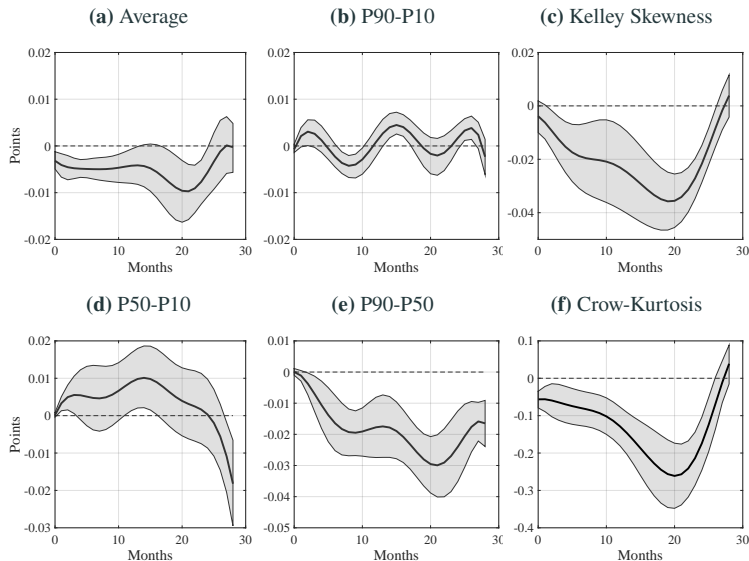
- Average income growth ↓
- No effect on dispersion
- Skewness ↓
- Skewness falls from both tails!

$$S_{t\downarrow} = \frac{(\mathcal{P}_{90t} - \mathcal{P}_{50t})\downarrow\downarrow - (\mathcal{P}_{50t} - \mathcal{P}_{10t})\uparrow}{(\mathcal{P}_{90t} - \mathcal{P}_{10t})}$$

## The response of skewness is large

- $\Delta S_t \approx -0.035$  to 25bp is large
- In the GFC  $\Delta S_t \approx -0.2$
- 75bp → around half the GFC

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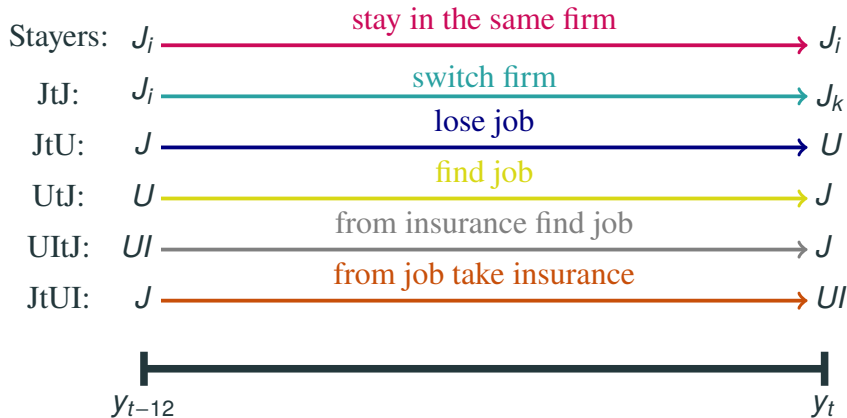
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## **Income Risk from Labor Flows**

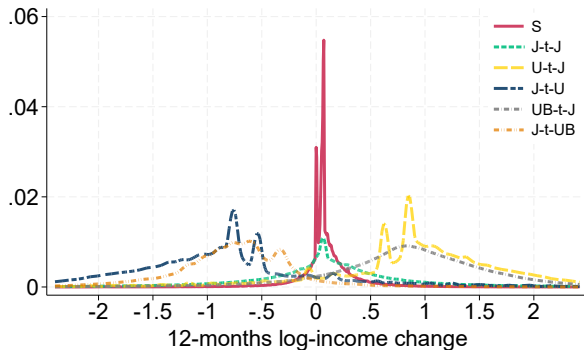
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## Labor Market Flows: Definitions

- Three states:  $J$  (work),  $U$  (unemployment),  $UI$  (Unemployment Insurance)
- Flow: state in  $t$  compared with state in  $t - 12$  (ignore “within period” flows)



# Labor Market Flows: Descriptive Statistics

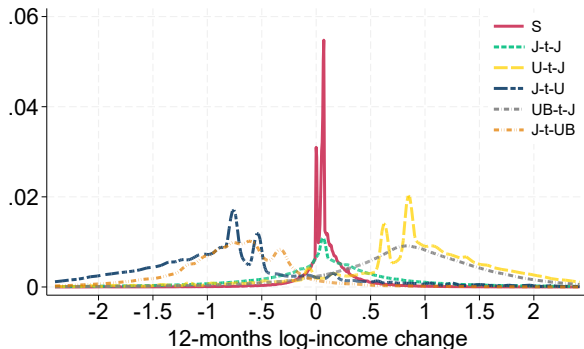


Note: Distributions for 2015. All distributions sum to one.

- Job-to-Job, Job-to-Unemployment Insurance, Unemployment Insurance-to-Job
- Stayers, Unemployment-to-Job, Job-to-Unemployment



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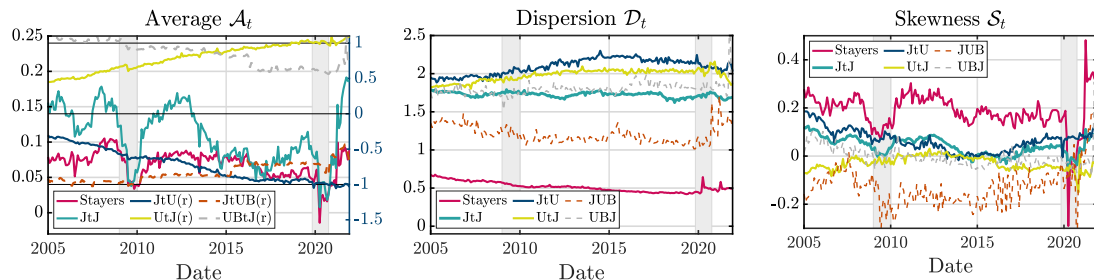
Note: Distributions for 2015. All distributions sum to one.

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**Table 1:** Flows 12-month changes.

Flow	Pct.	$\mathcal{A}$	$\mathcal{D}$	$\mathcal{S}$
<b>Stayers</b>	39.02	0.07	0.36	0.19
<b>JtJ</b>	16.13	0.11	0.84	0.04
<b>JtUI</b>	0.42	-0.78	0.63	-0.01
<b>JtU</b>	9.67	-0.74	0.95	-0.14
<b>UtJ</b>	10.29	0.82	0.90	-0.03
<b>UItJ</b>	0.21	0.80	0.83	-0.07
Jan-05 to Dec-21. N: 1006780473				

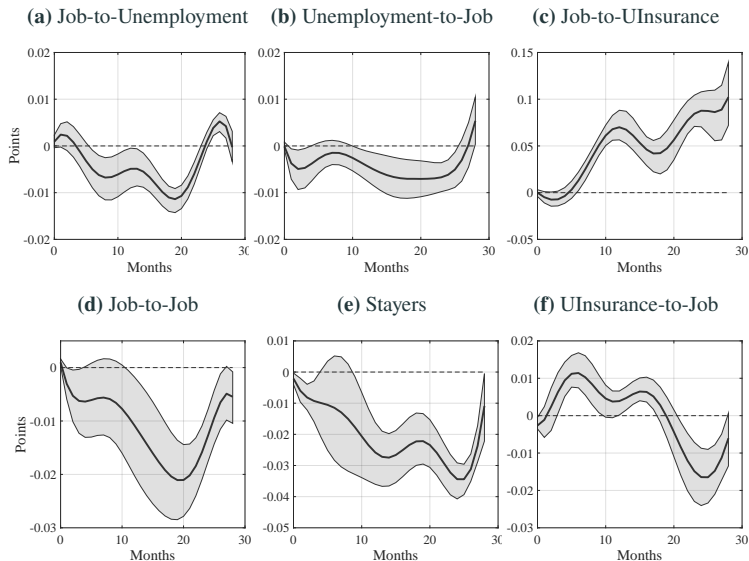
# Distribution of Labor Market Flows over the Business Cycle: 12-month Changes



Note: gray bars indicate recessions measured as more than three consecutive month with negative y-o-y GDP growth. These are 2009m1-2009m10 and 2020m3-2020m10

- **Average:** procyclical mostly **JtJ** and **Stayers**
- **Dispersion:** ( $\mathcal{D}_t = \mathcal{P}_{90t} - \mathcal{P}_{10t}$ ) is **acyclical** in all flows
- **Risk:** countercyclical.  $\mathcal{S}_t = \frac{(\mathcal{P}_{90t} - \mathcal{P}_{50t}) - (\mathcal{P}_{50t} - \mathcal{P}_{10t})}{\mathcal{P}_{90t} - \mathcal{P}_{10t}}$  is **procyclical** mostly **JtJ** and **Stayers**

# Moments of Flows: Response of **Skewness** to MP Shocks



## Moments of Flows to 25bp increase

- **JtU** and **UtJ** skewness ↓
- **JtJ** and **Stayers** skewness ↓ too!
- → **U** not the only source high risk
- UI helps to mute higher risk
- UI result implies the existence of an optimization from workers

► Averages Fall

► Dispersion mixed

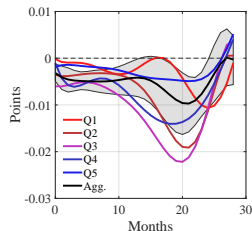
► Flows as expected

# **Heterogeneity across Income Distribution**

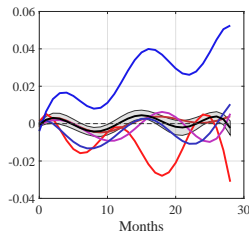
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# Heterogeneity: Response to MP shock

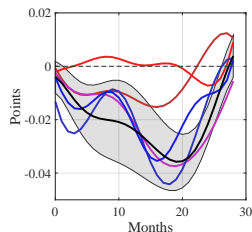
(a) Averages



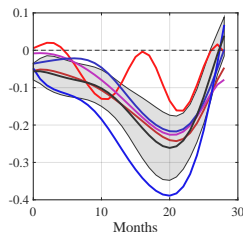
(b) P90-10s



(c) Kelleys



(d) Crows



- For lower quintiles of income the MP shock affects the level, while for high quintiles the shock moves the risk.
- **Avg:** Q2 and Q3 Average income growth exhibit the highest response to a MP shock.
- **Ske:** Q3, Q4 and Q5 the Kelley response is deeper and longer lasting.
- The Kurtosis affects similarly all quintiles, except the Q1.

# Conclusions

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# Conclusion and Next Steps

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## Conclusions

- We revisit the countercyclicality of labor income risk and study how it responds to MP shocks
- We show that **risk** measured by the skewness earnings growth **increases** in response to MP shock
- We show that **all** labor market flows contribute to aggregate skewness after an MP shock
- That suggests income risk goes beyond unemployment risk
- For low income groups, the MP shock affects the **levels** of its income growth distribution
- For high income groups a MP shock affect its **income risk**

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## Next steps

- Study the flows of other shocks (external rate, commodity prices)
- Finish the model (in early stage) and calibrate it to Chile
- Heterogeneity and the role of firms

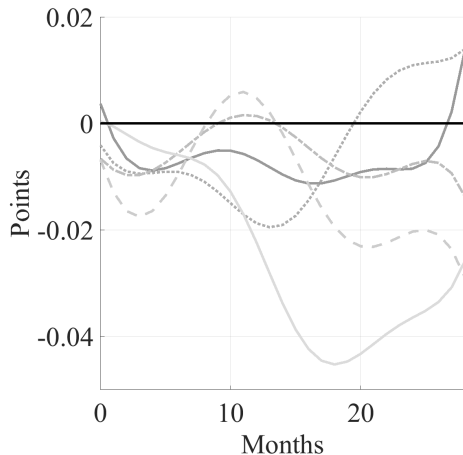


# Appendix

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# Heterogeneity

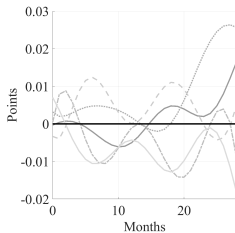
- Major difference between  $Q$ s are on the third moment.
- The  $Q5$  skewness respond significantly, while  $Q1$  and  $Q2$  return to its previous level the quickest.
- The larger response in flow terms come from the richest part of the distribution. (Next slide)



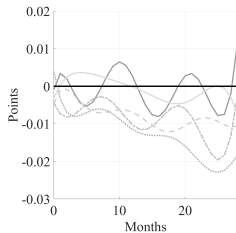
Note: Quintiles obtained as individuals' FE coefficient.

# Skewness by Quintile/Flow

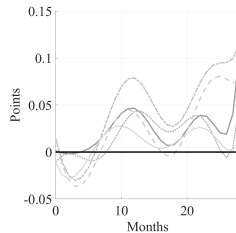
**(a) Job-to-Unemployment**



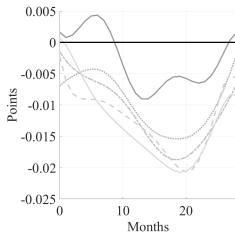
**(b) Unemployment-to-Job**



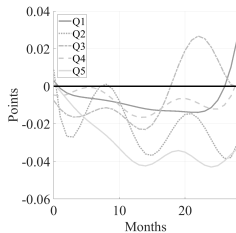
**(c) Job-to-UInsurance**



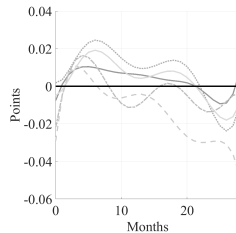
**(d) Job-to-Job**



**(e) Stayers**



**(f) UInsurance-to-Job**



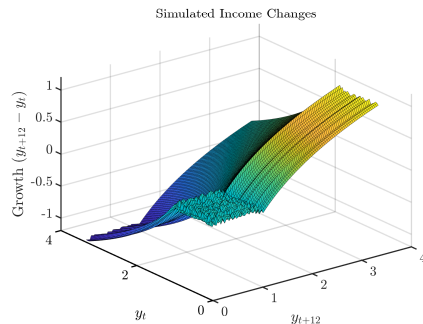
◀ Back

- If wages are low or zero, we use

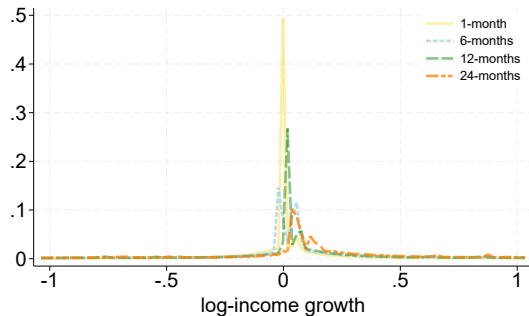
$$\hat{y}_{i,t} = \ln \left( \bar{w}_{min} + \frac{\bar{w}_{min}}{10(\bar{w}_{min} + 10)} \{ \exp(w_{i,t}) + 10U[0, 1] \} \right)$$

$$\rightarrow w_{i,t} = 0, \hat{y}_{i,t} = \ln(\bar{w}_{min} + \Delta)$$

- $w_{i,t} = 0$  has relevant information for income risk (UtJ, JtU).
- Calculate an approx log-change if unemployed at  $t$  or  $t+h$
- Preserve the earnings' ranking among individuals.
- log-changes in UtJ and JtU have a distribution
- Fluctuations with zeros represent compositional effects



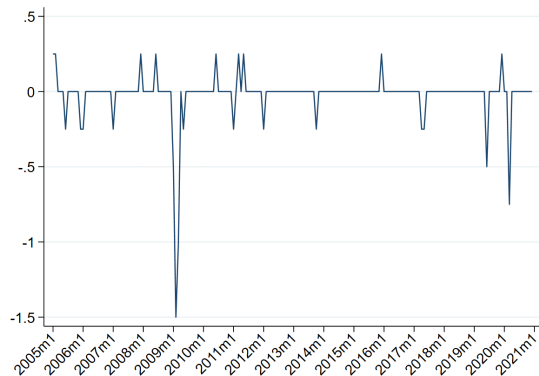
(a) 2015

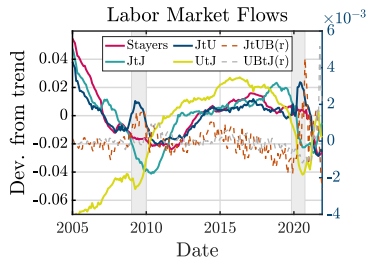


**Table 2:** Description of  $\delta w$  h-month changes.

H	Mean	Std. Dev	Kelley
<b>1-M</b>	0.005	0.167	0.082
<b>6-M</b>	0.033	0.442	0.040
<b>12-M</b>	0.067	0.551	0.103
<b>24-M</b>	0.138	0.663	0.062
Jan-2015 to Dec-2015. N=70795178			

**Figure 8:** Monetary Shocks in Chile, 2002-2021 (Aruoba et al., 2022)

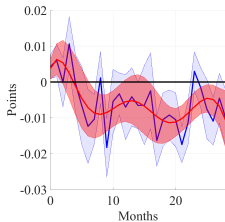




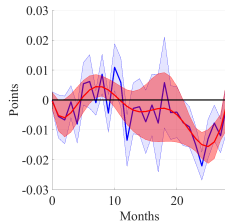
Note: gray bars indicate recessions measured as more than three consecutive month with negative y-o-y GDP growth. These are 2009m1-2009m10 and 2020m3-2020m10

[◀ Back](#)

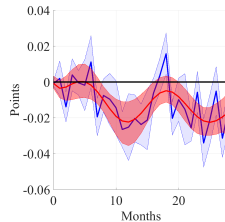
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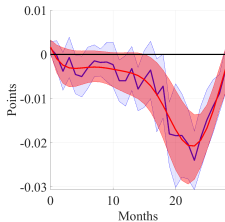
**(b) Unemployment-to-Job**



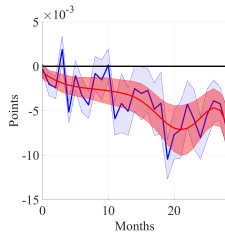
**(c) Job-to-UInsurance**



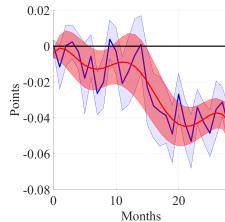
**(d) Job-to-Job**



**(e) Stayers**



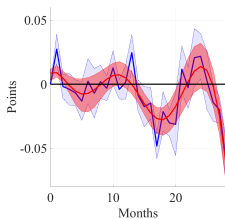
**(f) UInsurance-to-Job**



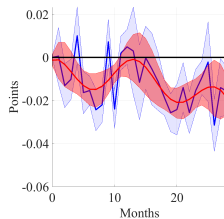


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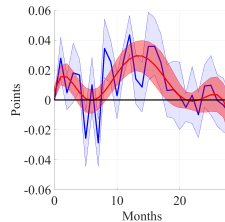
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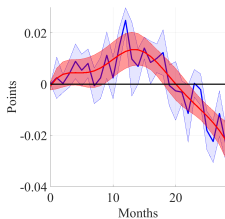
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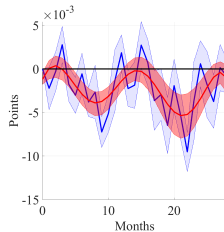
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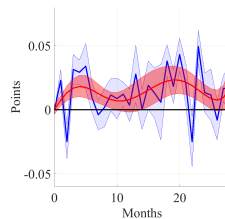
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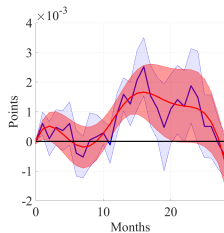
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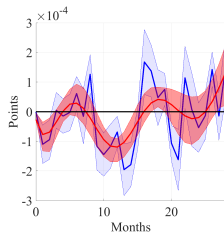
# Flows as expected

◀ Back

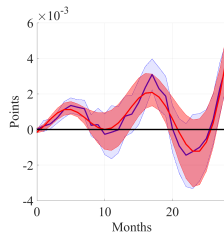
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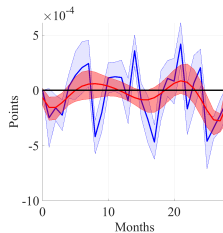
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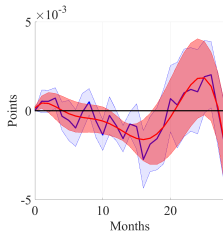
**(c) Remain Unemployed**



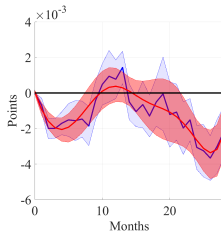
**(d) Job-to-UInsurance**



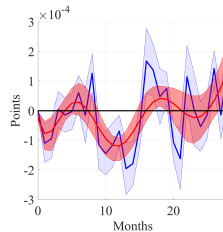
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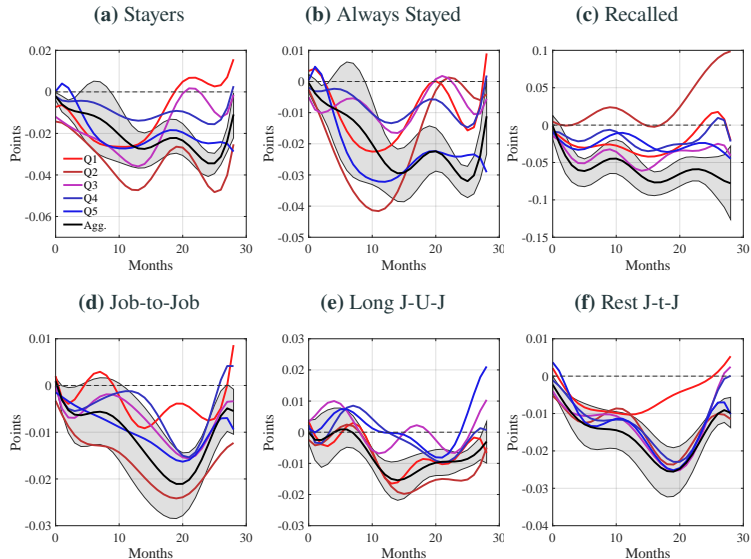
**(f) Stayers**



**(g) UInsurance-to-Job**



# Heterogeneity income & flows: Response to MP shock



- Conditional to remain in job the  $Q1$  is the group that face the higher income risk
- When passing through a long period of unemployment  $Q1$  faces the major income risk