

Inaccurate Beliefs and Cyclical Labor Market Dynamics

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Motivation

- Long-standing questions in the macro labor market:
 - Why is unemployment so volatile and persistent?
- New channel: **Inaccurate beliefs about aggregate productivity**
 - New empirical evidence on household beliefs and labor market decisions
 - Model of belief formation to study their implications on aggregate fluctuations
- Also provides insights to:
 - Why is the job separations more cyclical for high-wage workers? [Mueller \(2017\)](#)
 - Why similar workers have drastically different transition patterns across employment states? [Hall and Kudlyak \(2019\)](#) [Ahn et al. \(2023\)](#) [Gregory et al. \(2025\)](#)

This Paper

- New evidence on beliefs from survey data:
 - Household beliefs about unemployment systematically lag actual changes
 - Workers with more optimistic expectations about labor market prospects demand higher wages
- DMP model with imperfect info
 - The distribution of worker beliefs are lagged and dispersed
 - Workers bargain for wages with firms based on their own beliefs
 - The distribution of worker beliefs affects firm's vacancy posting and layoffs
 - Better informed firms (share a common belief):
 - Bargain for wages, make hiring and layoff decisions according to their beliefs

Main Findings

- Aggregate fluctuations
 - Worker–firm belief gap drives the volatility in job creation \Rightarrow Amplification
 - Dispersion in worker beliefs affects layoffs
 - \Rightarrow Optimistic workers are hired at higher wages and face higher separation risks
 - \Rightarrow Composition of unemployment
 - Firm learning dampens the volatility and generates more persistence
- Heterogeneous transition patterns
 - Differences in learning rate and persistence in biases \Rightarrow Heterogeneity

Literature

- Survey evidence on beliefs and labor market decisions/outcomes: Campbell et al. (2007), Conlon et al. (2018), Mitra (2023), Balleer et al. (2024), Jäger et al. (2024)

Contribution: New GE framework

- DMP models with information friction about aggregate productivity in GE:
 - Asymmetric beliefs about the aggregate: Menzio (2023), Morales-Jiménez (2022)
 - Biased beliefs about the aggregate: Mitra (2024), Bhandari et al. (2025)

Contribution: Dispersion + endogenous separations + role of firm beliefs

- Other DMP models with imperfect info:
 - Firm's private information on match quality: Azariadis and Stiglitz (1983), Kennan (2010)
 - Worker's private information on types: Acharya and Wee (2020), Birinci et al. (2025)

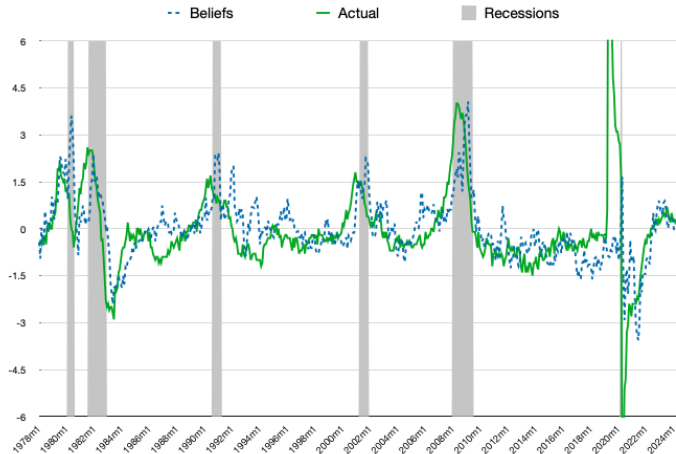
Contribution: Belief formation on aggregate productivity disciplined by survey data

- Connect to the larger literature on amplification and persistence: Shimer (2005), Elsby and Michaels (2013), Ljungqvist and Sargent (1998), Marimon and Zilibotti (1999), Hornstein et al. (2007)...
 - Stick-wages: Hall (2005), Shimer (2010), Gertler and Trigari (2009), Gertler et al. (2020)...

Roadmap

- Motivation evidence from survey data
- DMP model with imperfect information
- Calibration
- Quantitative results about aggregate fluctuations
 - Amplification and persistence of aggregate shocks
 - Comovements of pre-displacement wage and unemployment rate
 - Heterogeneous transition patterns

Household beliefs lag the actual change in unemployment rate



Perceived and actual changes in unemployment rate (Both standardized). Source: MSC, FRED.

- Du et al. (2024) also documents a lag using SCE

More Optimistic Workers have Higher Reservation Wage of Working

- Survey of Consumer Expectations: 2014m3–2023m7
- Cross-section: Workers expecting higher job-finding rates set higher reservation wages
- Time series: Larger increases in unemployment expectations are associated with larger reductions in reservation wages

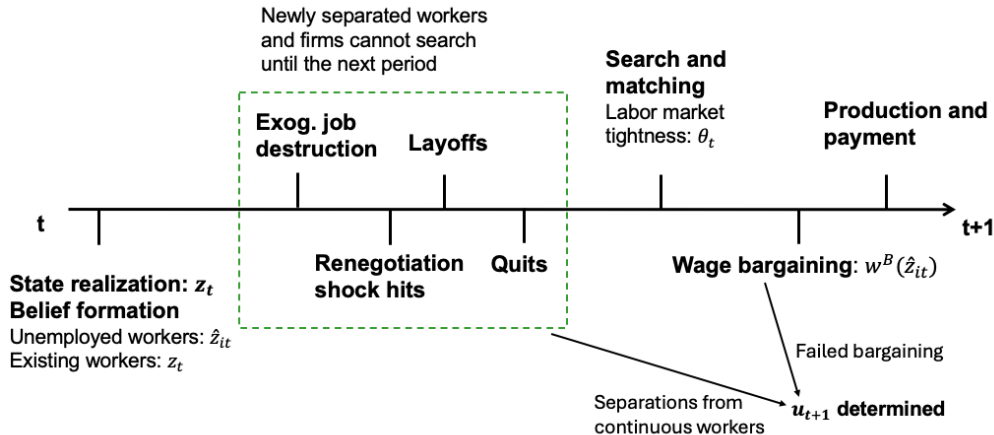
Survey Questions and Regression equations

Table: Beliefs and Reservation Wages $\log(w^r)$

| | <i>Exp job-finding rate</i> | | | <i>Exp unemployment rate</i> | | |
|------------------|-----------------------------|------------------------|--------------------------|------------------------------|------------------------|----------------------------|
| | <i>employed</i> (1) | <i>employed</i> (2) | <i>unemployed</i> (3) | <i>all</i> (4) | <i>employed</i> (5) | <i>non-employed</i> (6) |
| Beliefs | 0.178*** (0.032) | 0.102*** (0.027) | 0.005* (0.003) | -0.114** (0.053) | -0.096* (0.052) | -0.132 (0.128) |
| Household income | ✓ | | ✓ | | | |
| Worker income | | ✓ | | | | |
| Demographics | ✓ | ✓ | ✓ | | | |
| Worker FE | | | | ✓ | ✓ | ✓ |
| Time FE | ✓ | ✓ | ✓ | ✓ | ✓ | ✓ |
| Observations | 19,035 | 18,989 | 802 | 28,318 | 19,049 | 8,231 |
| R^2 | 0.215 | 0.364 | 0.133 | 0.485 | 0.514 | 0.419 |

DMP Model with Inaccurate Beliefs

Model: Timeline



Aggregate Productivity and Belief Formation

- Aggregate productivity: $z_t = \rho z_{t-1} + \varepsilon_t, \quad \varepsilon_t \sim \mathcal{N}(0, \sigma_z^2)$
- Heterogeneous worker beliefs: $\hat{z}_{it} = \hat{z}_t^w + \eta_{it}, \quad \eta_{it} \sim \mathcal{N}(0, \sigma_s^2) \Rightarrow \text{dispersion}$

$$\hat{z}_t^w = \hat{z}_{t-1}^w + \gamma^w \underbrace{(z_{t-1} - \hat{z}_{t-1}^w)}_{\text{forecast error}}, \quad 0 < \gamma^w < 1 \Rightarrow \text{delay}$$

\Rightarrow Distribution of worker beliefs $G_t \sim \mathcal{N}(\hat{z}_t^w, \sigma_s^2)$

(Perceived distribution of worker beliefs $\hat{G}_{it} \sim \mathcal{N}(\hat{z}_{it}, \sigma_s^2)$)

Strategic Considerations: Firms

- Workers and firms bargain \Rightarrow beliefs about others' expectations affect decisions
- Assume firms observe the true productivity z_t and the actual distribution of current worker beliefs $G_t \Rightarrow$ relaxed later
 - \Rightarrow firms use z_t and G_t to compute
 - the expected distribution of future worker beliefs
 - workers' value functions: expected reservation wages, and bargaining wages
 - resulting labor market tightness and own reservation wage

Strategic Considerations: Workers

- Each worker believes their own info is accurate and that firms also use this belief in wage setting
- Worker i perceives that other workers' beliefs are distributed as \hat{G}_{it} , centered on \hat{Z}_{it}
 - \Rightarrow worker i uses \hat{Z}_{it} and \hat{G}_{it} to compute
 - the *perceived* value functions of firms, labor market tightness, job-finding rate, firms' reservation wage
 - own reservation wage and bargained wage

Value Functions: Firms

- Dist. of beliefs affect the value of a filled job and firm's vacancy posting incentives
- Value of a filled job:

$$\begin{aligned}
 (1) \quad J(z, w) = & z - w + \beta(1 - \delta) \mathbb{E} \left[\underbrace{\lambda \mathbb{1}(w^r(z') < w)}_{\text{Workers might quit}} \underbrace{\max\{J(z', w), V(z')\}}_{\text{Whether to layoff}} \right. \\
 & \left. + (1 - \lambda) \underbrace{J(z', w^B(z'))}_{\text{Renegotiation}} \right]
 \end{aligned}$$

- Value of vacancy and free entry condition:

$$(2) \quad V(z) = -\kappa + \beta \mathbb{E} q(\theta) \underbrace{\left\{ \int_{\hat{z}_i} \max\{J(z', w^B(\hat{z}_i)), V(z')\} dG \right\}}_{\text{Expected value of a new hire}} = 0$$

- Firm's acceptable wages:

$$(3) \quad \{w : w \leq \bar{w}^f(z) \text{ and } J(z, \bar{w}^f(z)) = 0\}$$

Perceived Value Functions: Workers

- Worker's belief affects their perceived job-finding rate and layoff prob.
- Perceived value of a filled job

$$(4) \quad J(\hat{z}, w) = \hat{z} - w + \beta(1 - \delta) \hat{\mathbb{E}} \left[\lambda \mathbb{1}(w^r(\hat{z}') < w) \max\{J(z', w), V(z')\} + (1 - \lambda) J(z', w^B(\hat{z}')) \right]$$

- Perceived value of vacancy \Rightarrow Perceived job-finding rate $f(\hat{\theta})$

$$(5) \quad V(\hat{z}) = -\kappa + \beta q(\hat{\theta}) \hat{\mathbb{E}} \int_{\hat{z}_i} \max\{J(z', w^B(\hat{z}_i)), 0\} d\hat{G} = 0$$

- Perceived reservation wage of the firm

$$(6) \quad \{w : w \leq \hat{w}^f(\hat{z}) \text{ and } J(\hat{z}, \hat{w}^f(\hat{z})) = 0\}$$

Perceived Value Functions: Workers

- Perceived strategies of the firm affects the worker's perceived value functions
- Worker's perceived value of working:

$$\begin{aligned}
 (7) \quad W(\hat{z}, w) = & w + \beta \mathbb{E} \left\{ \underbrace{\left[\delta + (1 - \delta) \lambda \mathbb{1}(w > \bar{w}^f(\hat{z}')) \right]}_{\text{Involuntary separations}} U(\hat{z}') \right. \\
 & + \underbrace{(1 - \delta) \lambda \mathbb{1}(w < \bar{w}^f(\hat{z}')) \max\{W(\hat{z}', w), U(\hat{z}')\}}_{\text{Quits}} \\
 & \left. + \underbrace{(1 - \delta)(1 - \lambda) W(\hat{z}', w^B(\hat{z}'))}_{\text{Renegotiation}} \right\}
 \end{aligned}$$

Perceived Value Functions: Workers

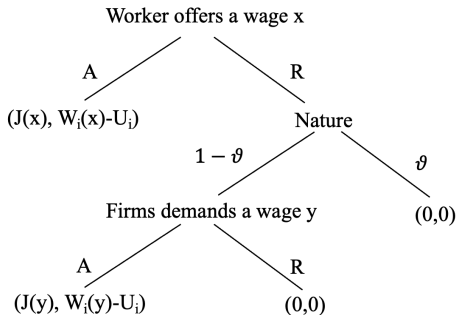
- Value of unemployment:

$$(8) \quad U(\hat{z}) = b + \beta \hat{\mathbb{E}} \left\{ f(\hat{\theta}) W(\hat{z}', w^B(\hat{z})) + (1 - f(\hat{\theta}')) U(\hat{z}') \right\}$$

- Worker's perceived value functions determine
 - The range of acceptable wages:

$$(9) \quad \{w : w \geq \underline{w}^r(\hat{z}) \quad \text{and} \quad W(\hat{z}, \underline{w}^r(\hat{z})) = U(\hat{z})\}$$

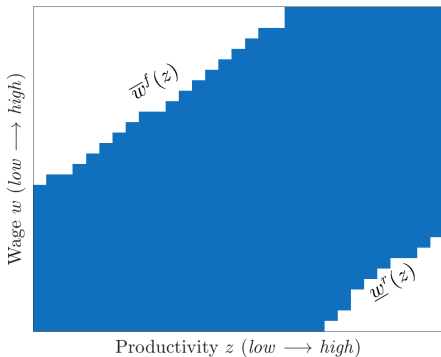
Model: Wage Bargaining Game



- Worker makes the first offer: giving firms $1 - \vartheta$ of the *percieved* matching surplus, *thinking* that the firm will always accept
- Firms accept if it's below its reservation wage
- Otherwise, the match is dissolved

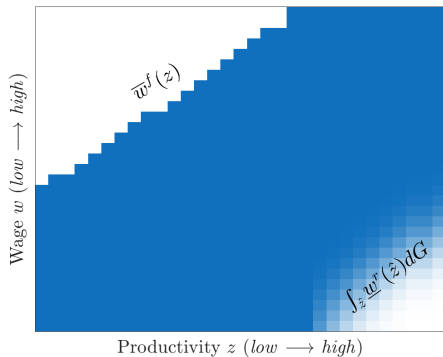
Steady State Rejection Probability: Full Info

- Wage rigidities + two-sided lack of commitment \Rightarrow endogenous separations
 - Firms lay off workers when the true state is low and current wage is high
 - Workers quit the job when their belief is high and current wage is low
 - All bargaining result in matches



Steady State Rejection Probability: Noisy Beliefs

- Noisy beliefs create a region with nonzero probability of failed negotiation



Model Mechanism

- **Amplification:** Lagged worker beliefs \Rightarrow slow adjustment for wages of new hires \Rightarrow larger volatility in job creation
- **Persistence:** Firm learning \Rightarrow dampened and sluggish response in all variables
- Firms hire high-wage workers, knowing they can fire them later
- Dispersion in beliefs \Rightarrow wage dispersion \Rightarrow \uparrow separations of high wage workers in recessions
 - \Rightarrow Shift in the composition of unemployment
 - \Rightarrow Heterogeneity

Calibration

Calibration: Belief Parameters

- MSC 1978m1-2020m2
 - Cross-sectional dispersion in beliefs
 - Calibrate σ_s to match time-average of $\sigma_u = \frac{1}{T} \sum_t \tilde{\sigma}_t = 0.2$ in data
 - Worker's learning rate
 - Calibrate learning rate γ^w to match learning rate in data (0.093)
- (10) $UNEMPL_t^e = \beta_1 UNEMPL_{t-1} + \beta_2 UNEMPL_{t-1}^e + \epsilon_t$

Reg results

Parameters

| | Description | Value | Source |
|-------------|--------------------------------|-------|------------------------|
| ρ | Persistence of z | 0.983 | GHT |
| σ_z | Standard Deviation of z | 0.007 | GHT |
| β | Discount factor | 0.997 | GHT (3% interest) |
| λ | Renegotiation frequency | 11/12 | GHT (every 4 quarters) |
| α | Matching elasticity to v | 0.5 | Blanco et al. (2024) |
| ϑ | Bargaining power of the worker | 0.6 | within the range |

- GHT = Gertler et al. (2020)

| | Description | Value | Target | Moment |
|------------|---------------------------|-------|----------------------------------|--------|
| δ | Exog job destruction rate | 0.018 | Unemploy. rate = 6.1% | 6.1% |
| b | Unemp benefit | 0.650 | 0.7 of median state productivity | 0.65 |
| A | Matching efficiency | 0.328 | Job finding rate = 27.7% | 27.8% |
| κ | Cost of vacancy posting | 0.289 | Labor market tightness = 0.720 | 0.719 |
| σ_s | Std. dev. of beliefs | 0.019 | MSC $\sigma_u = 0.20$ | 0.199 |
| γ^w | Learning rate of HH | 0.085 | MSC $\beta^1 = 0.093$ | 0.095 |

Quantitative Results

- Aggregate fluctuations
- Cyclical job separations
- Distributional consequences

Business Cycle Summary Statistics

| | p | u | f | s | θ |
|--|-------|-------|-------|-------|----------|
| <i>Panel A: Data</i> | | | | | |
| Standard Deviation | 0.010 | 0.103 | 0.053 | 0.067 | 0.229 |
| Quarterly Autocorrelation | 0.746 | 0.934 | 0.871 | 0.773 | 0.936 |
| <i>Panel B: Full Info</i> | | | | | |
| Standard Deviation | 0.014 | 0.025 | 0.020 | 0.012 | 0.041 |
| Quarterly Autocorrelation | 0.727 | 0.795 | 0.719 | 0.505 | 0.719 |
| <i>Panel C: HH Learning</i> | | | | | |
| Standard Deviation | | | | | |
| Quarterly Autocorrelation | | | | | |
| <i>Panel D: HH Learning + Dispersion</i> | | | | | |
| Standard Deviation | | | | | |
| Quarterly Autocorrelation | | | | | |
| <i>Panel E: HH Learning + Dispersion + Firm Learning</i> | | | | | |
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Business Cycle Summary Statistics

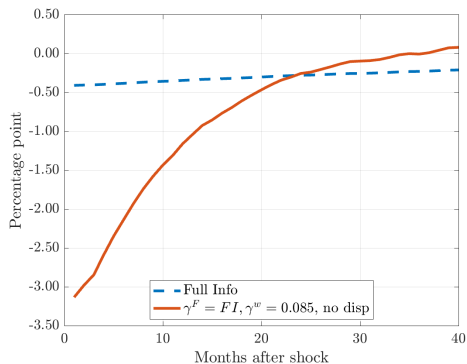
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| <i>Panel D: HH Learning + Dispersion</i> | | | | | |
| Standard Deviation | 0.014 | 0.115 | 0.139 | 0.020 | 0.279 |
| Quarterly Autocorrelation | 0.727 | 0.785 | 0.626 | 0.374 | 0.627 |
| <i>Panel E: HH Learning + Dispersion + Firm Learning</i> | | | | | |
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Business Cycle Summary Statistics

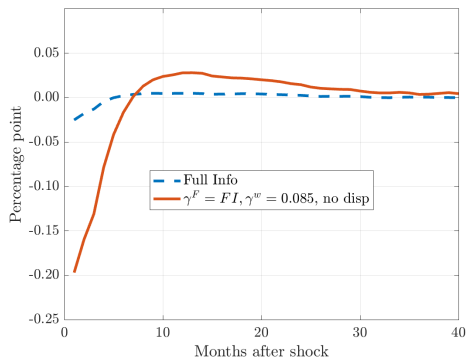
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| <i>Panel E: HH Learning + Dispersion + Firm Learning ($\gamma^F = 0.5$)</i> | | | | | |
| Standard Deviation | 0.014 | 0.092 | 0.110 | 0.015 | 0.219 |
| Quarterly Autocorrelation | 0.727 | 0.814 | 0.705 | 0.505 | 0.705 |

IRF: Belief Asymmetry Amplifies the Volatility in Job Creation

- Sluggish adjustment for household beliefs generates sticky wages for new hires
⇒ further reduce firm's vacancy posting incentives
- Larger drop in job-finding rate and job creation



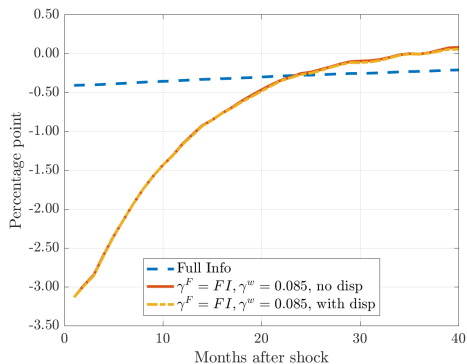
Job-finding probability



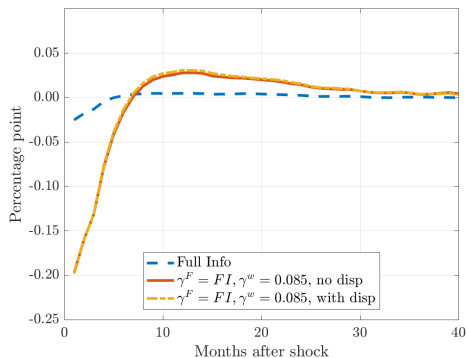
New hires

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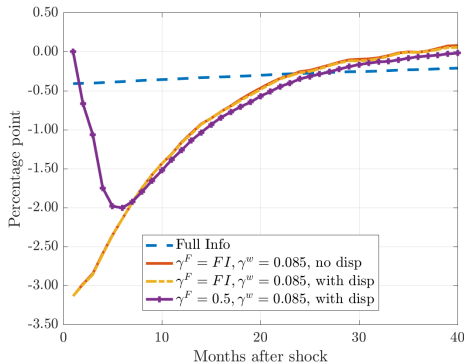


New hires

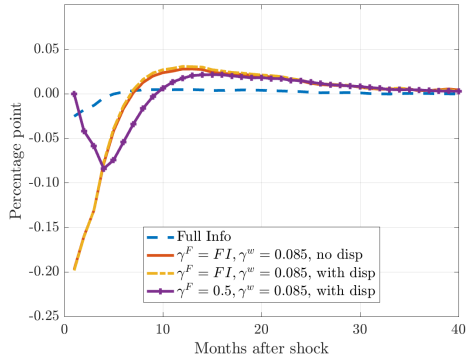
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Model with firm learning

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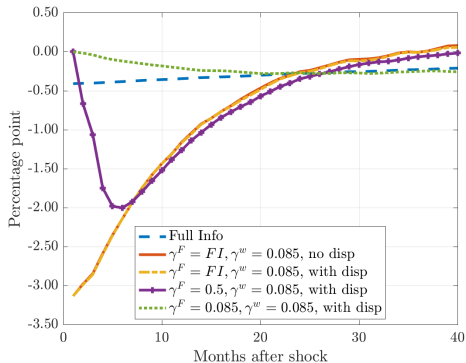


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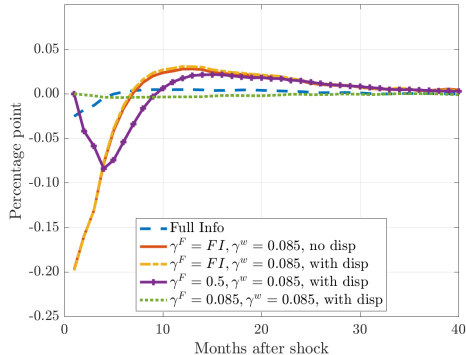
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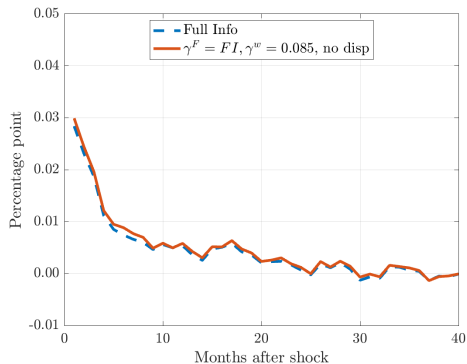
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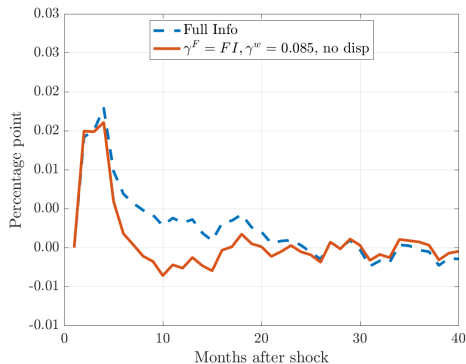
New hires

IRF: Dispersion in Beliefs Amplifies the Response in Separations

- Larger belief dispersion generates larger layoffs
- Firm learning dampens this result



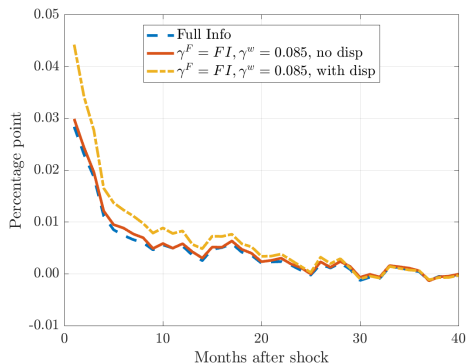
Layoffs



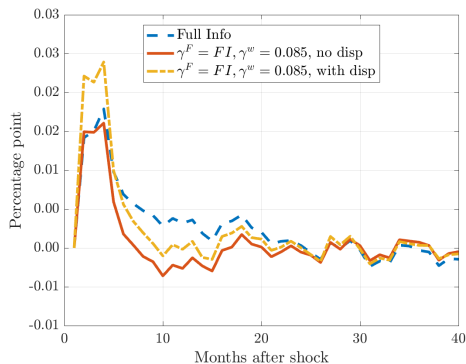
Job Separations

IRF: Dispersion in Beliefs Amplifies the Response in Separations

- More workers are hired closed to firm's layoff threshold
- The pool of unemployment shifts towards high-wage workers during recessions (Mueller (2017))



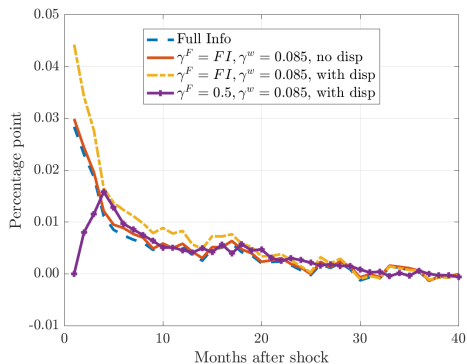
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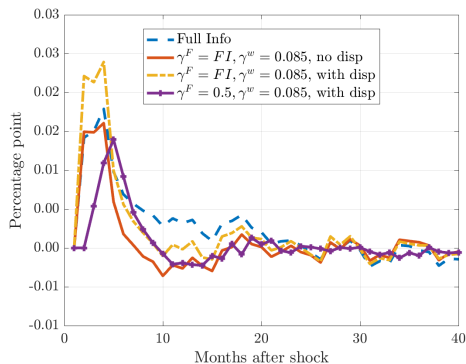
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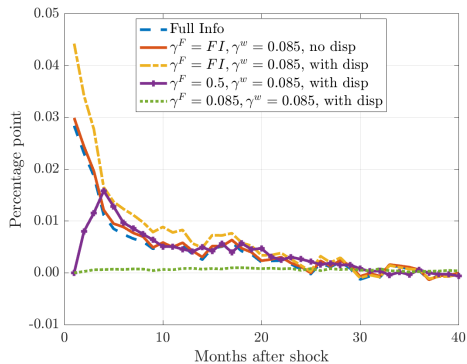
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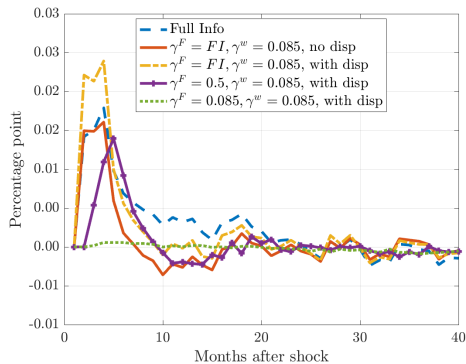
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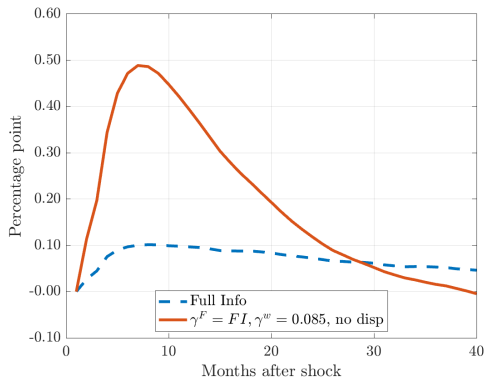
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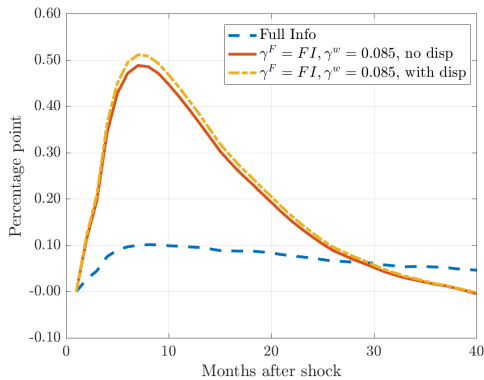
IRF: Belief Asymmetry and Dispersion Generates Larger volatility in Unemployment Rate

- Asymmetry \Rightarrow Larger drop in job-finding rate \Rightarrow smaller outflows
- Dispersion \Rightarrow Larger layoffs \Rightarrow larger inflows
- Firm learning \Rightarrow dampens volatility and generates more persistence



IRF: Belief Asymmetry and Dispersion Generates Larger volatility in Unemployment Rate

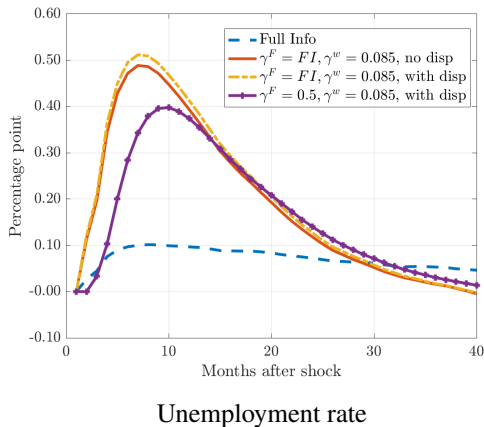
- Asymmetry \Rightarrow Larger drop in job-finding rate \Rightarrow smaller outflows
- Dispersion \Rightarrow Larger layoffs and unsuccessful renegotiations \Rightarrow larger inflows



Unemployment rate

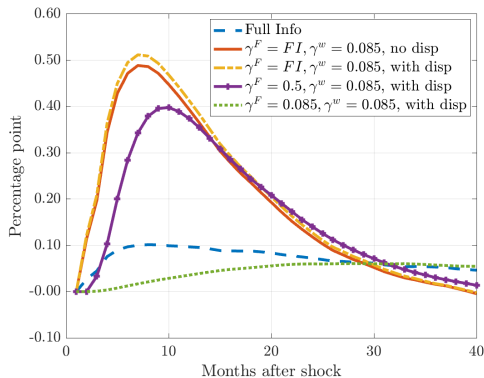
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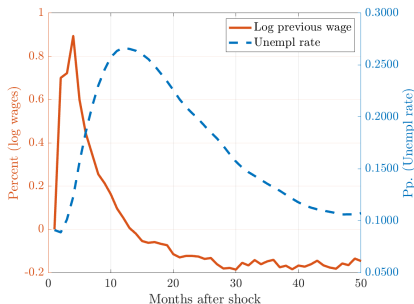


Unemployment rate

High-wage workers face more cyclical separations

- **Mueller (2017):** Comovements of pre-displacement wage and unemployment rate
- Driven by higher cyclical separations among high-wage workers; similar job-finding rates

CPS evidence



Comovements of pre-displacement wage and unemployment rate

Distributional Consequences of Inaccurate Beliefs

- Empirical Observation: Heterogeneous transition patterns across workers (Gregory et al. (2025), Hall and Kudlyak (2019), Ahn et al. (2023))
- Differences in learning rate or persistence in biases can partially explain this
- Two types of workers with different learning rates

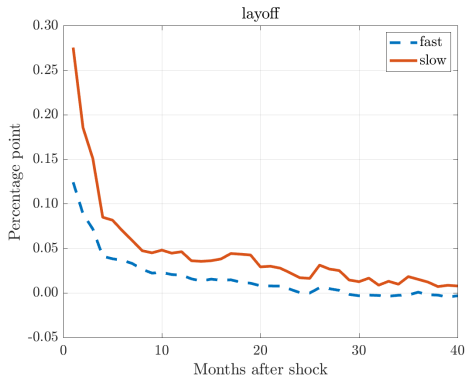
$$(11) \hat{z}_{it}^{fast} = \hat{z}_{t-1}^{fast} + \gamma^{fast}(z_{t-1} - \hat{z}_{t-1}^{fast}) + \eta_{it}$$

$$(12) \hat{z}_{it}^{slow} = \hat{z}_{t-1}^{slow} + \gamma^{slow}(z_{t-1} - \hat{z}_{t-1}^{slow}) + \eta_{it}$$

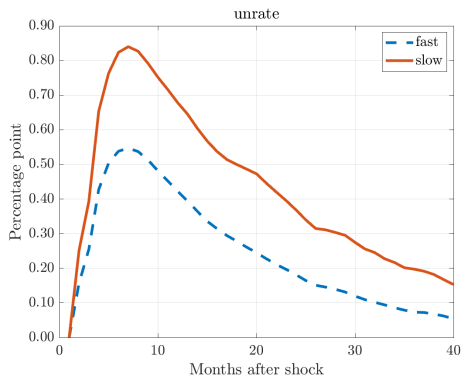
- $\gamma^{slow} = 0.02, \gamma^{fast} = 0.20$

Diff. in Learning Rates Helps Explain Heterog. Transition Patterns

- Slow updating workers are relatively more optimistic at the beginning of the recession
⇒ Hired at higher wages ⇒ Higher layoff rates and Unemployment rate Persistent biases



Layoffs



Unemployment rate

Conclusion

- Theory about how systematic biases and idiosyncratic noise in beliefs about the aggregate affects labor market fluctuations and heterogeneous transition patterns
- Future work:
 - Interaction of noisy beliefs about aggregate, worker private info, and misperception of employers
 - Implications for job acceptance, search/on-the-job search, future separation risks

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Belief Parameters: Michigan Survey of Consumers

- Construct $\tilde{\mu}_t$, following Mankiw et al. (2003):
 - *"How about people out of work during the coming 12 months — do you think that there will be more unemployment than now, about the same, or less?"*
 - *"more unemployment," "less unemployment," "no change," "don't know."*
- Assumptions:
 - $E(\Delta \tilde{u}_{it})$ follows $N(\tilde{\mu}_t, \tilde{\sigma}_t^2)$.
 - Interpret "no change" as a small change within a threshold c .
- Back out $\tilde{\mu}_t$ and $\tilde{\sigma}_t$ from *%more unemployment* and *%less unemployment*

$$(13) \quad \%Up = 1 - F\left(\frac{-c - \tilde{\mu}_t}{\tilde{\sigma}_t}\right) \quad \%Down = F\left(\frac{c - \tilde{\mu}_t}{\tilde{\sigma}_t}\right)$$

- Higher $\tilde{\mu}_t$: more pessimism
- Higher $\tilde{\sigma}_t$: more dispersion in beliefs

Figure 1

Firm Learning Rate

Calibration

| | 1978m1-2020m2 (1) | 1978m1-2024m3 (2) |
|-----------|----------------------|----------------------|
| β_1 | 0.093*** (0.019) | 0.144*** (0.018) |
| β_2 | 0.887*** (0.018) | 0.849*** (0.018) |
| R^2 | 0.857 | 0.846 |

Regression about Reservation Wages

Reg Results

- *Q4: What do you think is the percent chance that 12 months from now the unemployment rate in the U.S. will be higher than it is now?*
- *For employed Q22: Suppose you were to lose your main job this month. What do you think is the percent chance that within the following 3 months, you will find a job that you will accept, considering the pay and type of work?*
- *For unemployed workers Q17: What do you think is the percent chance that within the coming 12 months, you will find a job that you will accept, considering the pay and type of work?*
- *For unemployed workers Q18: And looking at the more immediate future, what do you think is the percent chance that within the coming 3 months, you will find a job that you will accept, considering the pay and type of work?*
- *RW2: Suppose someone offered you a job today in a line of work that you would consider. What is the lowest wage or salary you would accept (BEFORE taxes and other deductions) for this job?*

$$(14) \log(\text{res wage})_{it} = \alpha_0 + \alpha_1 \text{Belief}_{it} + X_{it} + \epsilon_{it}$$

Business Cycle Summary Statistics

| | p | u | f | s | θ |
|--|-------|-------|-------|-------|----------|
| <i>Panel A: Data</i> | | | | | |
| Standard Deviation | 0.010 | 0.103 | 0.053 | 0.067 | 0.229 |
| Quarterly Autocorrelation | 0.746 | 0.934 | 0.871 | 0.773 | 0.936 |
| <i>Panel E: HH Learning + Dispersion + Firm Learning ($\gamma^F = 0.2$)</i> | | | | | |
| Standard Deviation | 0.014 | 0.064 | 0.066 | 0.017 | 0.132 |
| Quarterly Autocorrelation | 0.727 | 0.849 | 0.769 | 0.378 | 0.769 |
| <i>Panel F: HH Learning + Dispersion + Firm Learning ($\gamma^F = 0.3$)</i> | | | | | |
| Standard Deviation | 0.014 | 0.085 | 0.088 | 0.025 | 0.176 |
| Quarterly Autocorrelation | 0.727 | 0.833 | 0.758 | 0.324 | 0.758 |
| <i>Panel G: HH Learning + Dispersion + Firm Learning ($\gamma^F = 0.4$)</i> | | | | | |
| Standard Deviation | 0.014 | 0.098 | 0.101 | 0.031 | 0.202 |
| Quarterly Autocorrelation | 0.727 | 0.818 | 0.731 | 0.272 | 0.731 |

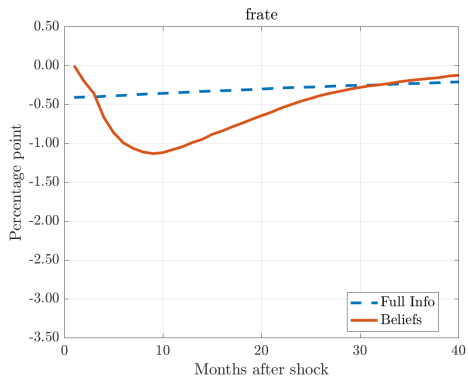
Main results

Learning for Firms

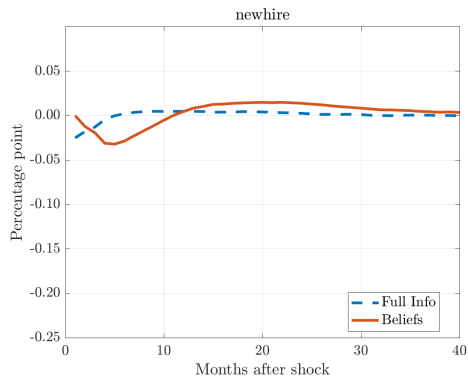
Main

- Adaptive learning for firms: $\hat{z}_t^f = \hat{z}_{t-1}^f + \gamma^f \underbrace{(z_{t-1} - \hat{z}_{t-1}^f)}_{\text{forecast error}}, \quad \gamma^f > \gamma^w \Rightarrow \text{delay}$
- Motivation evidence: firms have more accurate and less dispersed information relative to households (Mitman et al. (2022))
- Same as before, firm observe the current distribution of worker beliefs
- Firm use \hat{z}^f to update the distribution of worker beliefs in the next period
- Firms make hiring and layoff decisions based on their belief:
 - Delayed response in labor market tightness, job-finding rate and layoffs
 - Smaller belief asymmetry between workers and firms \Rightarrow dampens the aggregate volatility

Firm Learning IRFs



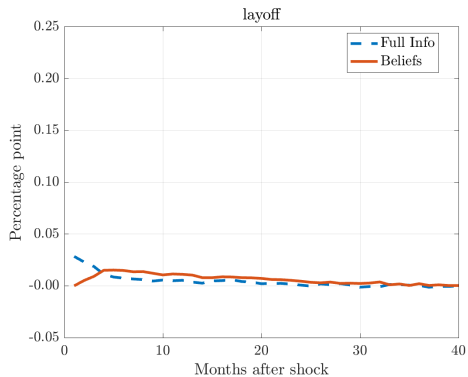
Job-finding rate



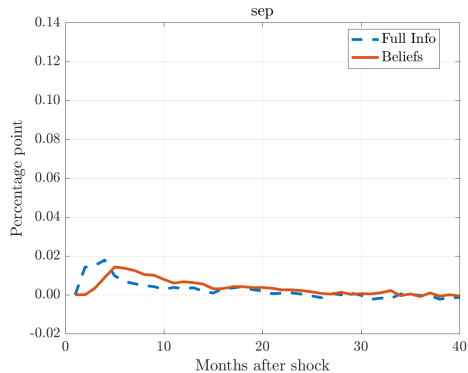
New hires

Main

Firm Learning IRFs



Layoffs



Separations

Main

Mueller 2017: Evidence from CPS

Main

Panel C. Mincer-residual

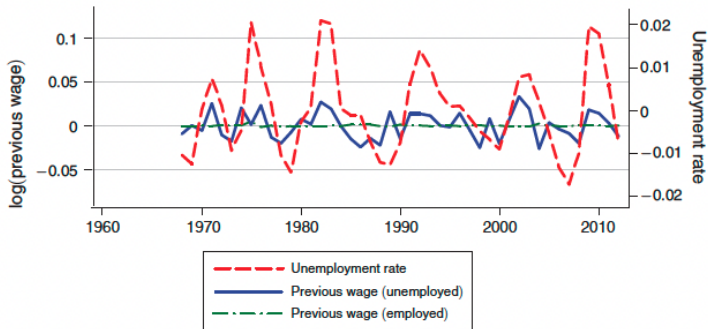


FIGURE 4. AVERAGE WAGE FROM PREVIOUS YEAR BY EMPLOYMENT STATUS IN THE CPS MARCH SUPPLEMENT, 1962–2012

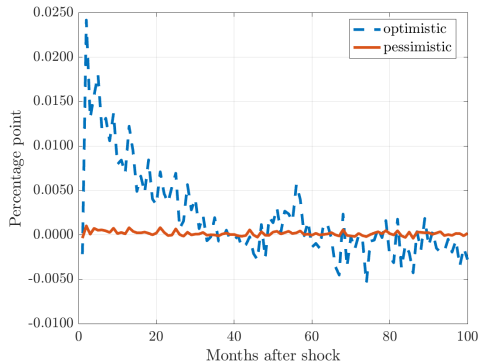
Persistent biases

- Layoffs are concentrated on the optimistic workers with higher wages

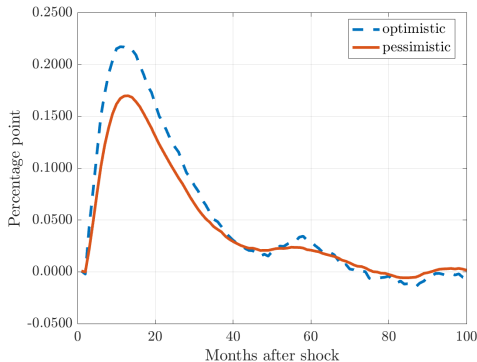
Main

$$\hat{z}_{it}^o = (1 - \gamma^w) \hat{z}_{t-1}^w + \gamma^w z_{t-1} + \zeta^o + \eta_{it}$$

$$\hat{z}_{it}^p = (1 - \gamma^w) \hat{z}_{t-1}^w + \gamma^w z_{t-1} + \zeta^p + \eta_{it}$$



Layoffs



Unemployment rate