### Temporary Layoffs, Loss-of-Recall, and Cyclical Unemployment Dynamics

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#### What We Do (1/2)

- ▶ Document the contribution of temporary layoffs (TL) to unemployment dynamics, from 1978 onwards
- Study contribution of "loss-of-recall" to the cyclicality of unemployment
- Develop model of unemployment fluctuations that distinguishes between temporary and permanent separations ...

#### What We Do (2/2)

- ► Model allows for two types of unemployment:
  - Jobless unemployment (JL): search for new job
  - Temporary-layoff unemployment (TL): wait for recall

Worker in  $u_{TL}$  moves to  $u_{JL}$  if prior job is destroyed (i.e., loss-of-recall)

- Calibrate model to dynamics of jobless and temporary-layoff unemployment using CPS, 1979-2019
- Adapt the model to study the Covid-19 labor market

#### Why We Do It (1/2)

#### Revisit recessionary impact of temporary layoffs

- ► Stabilizing "direct" effect: recalls  $\downarrow \Rightarrow u_{TL} \uparrow$ 
  - ▶ Workers in  $u_{TL}$  return to work faster than workers in  $u_{JL}$
  - Thus, TL's are stabilizing relative to permanent separations
  - Traditional view
- ▶ Destabilizing "indirect" effect: loss-of-recall  $\uparrow \Rightarrow u_{JL} \uparrow$ 
  - $\blacktriangleright$  Workers move from  $u_{TL}$  to  $u_{JL}$  at a higher rate during recessions
  - ► We estimate JL-from-TL to be countercyclical and highly volatile

Note: recall and loss-of-recall are endogenous and thus policy-dependent

#### Why We Do It (2/2)

- Onset of Covid-19 pandemic: surge of temporary layoffs
  - First month: 15% of employed workers move to  $u_{TL}$
  - $\triangleright$   $u_{TL}$  remains persistently high thereafter (across all sectors)
- Fiscal response: Paycheck Protection Program (PPP)
  - Forgivable loans for firms to recall workers
  - \$953-billion program— larger than 2009 Recovery Act
- What role did PPP play in shaping employment recovery?
  - ► What is the no-PPP counterfactual? Require structural model
- $\triangleright$  Our findings: Large monthly reductions in  $u_{JL}$  due to PPP
  - $ightharpoonup \approx$  2 p.p. in short-run,  $\geq$  1 p.p. thru May 2021
  - Achieved by preventing loss-of-recall

#### Plan

- ► Empirics of temporary-layoff unemployment
- Model (three stocks, five flows)
- Model evaluation

#### and then

► Application to Covid-19 Recession

### - . . .

**Empirics** of

**Temporary-Layoff Unemployment** 

& "Loss-of-Recall"

1.  $u_{TL}$  comprises just 1/8 of total unemployment (u)

Table: Unemployment, jobless unemployment, and temporary-layoff unemployment

	U =		
	JL + TL	JL	TL
mean(x)	0.062	0.054	0.008
std(x)/std(Y)	8.518	8.532	10.906
corr(x, Y)	-0.848	-0.810	-0.788

- 1.  $u_{TL}$  comprises just 1/8 of total unemployment (u)
- 2. But look at flows: E-to-TL's account for 1/3 of all separations to u

Table: Gross worker flows, 1978–2019 To					
From	E	TL	JL	1	
E	0.955	0.005	0.011	0.029	
TL	0.435	0.245	0.191	0.129	
JL	0.244	0.022	0.475	0.259	
1	0.043	0.001	0.027	0.929	

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- 3. And, JL-from-TL's return to employment at substantially lower rate

Table: Transitions from JL, TL, and JL-from-TL (1978–2019)

Ta

From	E	TL	JL	1
JL, unconditional	0.244	0.022	0.475	0.259
TL, unconditional	0.435	0.245	0.191	0.129
JL-from-TL	0.271	0.000	0.556	0.173

- 1.  $u_{TL}$  comprises just 1/8 of total unemployment (u)
- 2. But look at flows: E-to-TL's account for 1/3 of all separations to u
- 3. And, JL-from-TL's return to employment at substantially lower rate
- 4. E-to-TL's are particularly important during recessions:

#### Table: Cyclical properties, gross worker flows

		$p_{E,JL}$			
std(x)/std(Y)	11.264	4.962	6.609	7.126	10.084
corr(x, Y)	-0.393	-0.674	0.599	0.803	-0.192

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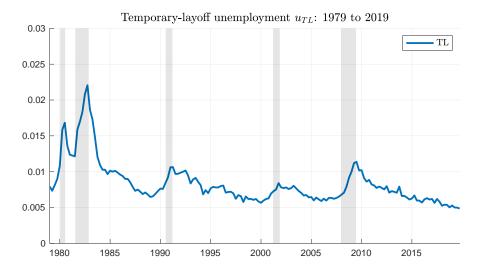
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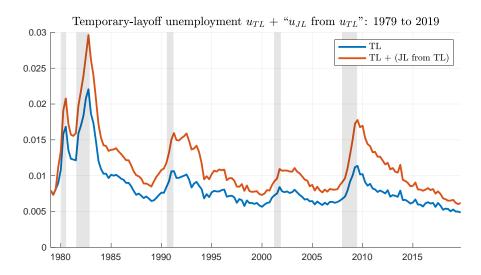
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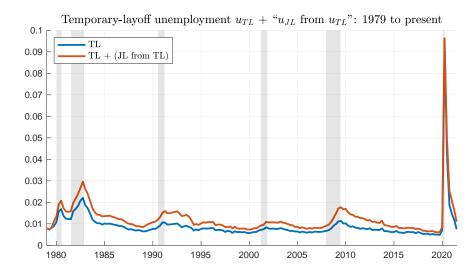
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Direct effect: p_{E,TL} \uparrow \& p_{TL,E} \downarrow \Rightarrow u_{TL} \uparrow
Indirect effect: p_{E,TL} \uparrow \& p_{TL,JL} \uparrow \Rightarrow u_{JL\text{-from-}TL} \uparrow
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- 5. We develop methods to estimate the indirect effect, i.e. JL-from-TL

Direct effect: 
$$p_{E,TL} \uparrow \& p_{TL,E} \downarrow \Rightarrow u_{TL} \uparrow$$
  
Indirect effect:  $p_{E,TL} \uparrow \& p_{TL,JL} \uparrow \Rightarrow u_{JL\text{-from-}TL} \uparrow$ 

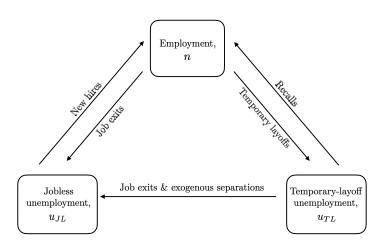






# Model

#### Model



#### Model

#### Starting point: RBC model with search and matching

- Perfect consumption insurance
- Wage rigidity via staggered Nash wage bargaining

#### Key variations:

- Endog. separations into temporary-layoff unemp.
- Recall hiring from temporary-layoff unemployment
- Endogenous separations into jobless unemployment
  - Allow for temporary paycuts: no inefficient separations
  - ▶ Permanent sep. triggers  $u_{TL} \rightarrow u_{JL}$  for some workers
- Hiring from jobless unemployment

#### **Details of Model**

- Unemployed are either in
  - JL: Searching for work in a DMP-style matching market
  - TL: Waiting for recall or loss-of-recall
- Firms, w/ CRS technology in labor and capital, draws cost shocks
  - ► Overhead costs to entire firm ⇒ separations to JL and JL-from-TL
  - Worker-specific overhead costs ⇒ separations to TL
- ► After separations: firms rent capital, hire from JL, and recall from TL
- Base wages set via staggered Nash bargaining
  - But temporary paycuts avoid inefficient exit



#### Firm's Problem

- Start of period, aggregate & worker shocks revealed.
- ► Then,
  - 1. Temporary layoffs: Firms assigns  $1 \mathcal{F}(\vartheta^*)$  workers to  $u_{TL}$
  - 2. Permanent separations: Common shock  $\gamma$  within firm
    - Firm exits if  $\gamma \geq \gamma^*$ , workers and TL's move to  $u_{JL}$
    - Otherwise, firm continues
  - 3. Continuing firms operate:
    - Rents capital and produces output
    - ▶ Hires workers from  $u_{JL}$ , recalls workers from  $u_{TL}$
    - Possibility of temporary paycuts, i.e. remitted wages  $\omega < w$
- Solve backwards

### Firm Problem (at non-exiting firms w/ TL policy $\vartheta^*$ )

Let  $J(w, \gamma, \mathbf{s})$  be firm's value per worker after TL's and exits. Then,

with

$$J(\boldsymbol{w}, \gamma, \mathbf{s}) = \max_{\boldsymbol{k}, \boldsymbol{x}, \boldsymbol{x}_{r}} \left\{ z \mathcal{F}(\vartheta^{*}) \boldsymbol{\check{k}}^{\alpha} - \omega \left( \boldsymbol{w}, \gamma, \mathbf{s} \right) \mathcal{F}(\vartheta^{*}) - r \mathcal{F}(\vartheta^{*}) \boldsymbol{\check{k}} \right.$$

$$\left. - \left( \iota(\boldsymbol{x}) \mathcal{F}(\vartheta^{*}) + \iota_{r}(\boldsymbol{x}_{r}) \mathcal{F}(\vartheta^{*}) \right) - \varsigma(\vartheta^{*}, \gamma) \right.$$

$$\left. + \mathbb{E} \left\{ \Lambda(\mathbf{s}, \mathbf{s}') \mathcal{J}(\boldsymbol{w}', \mathbf{s}') |, \boldsymbol{w}, \mathbf{s} \right\} \right\},$$

$$\varsigma(\gamma, \vartheta^{*}) = \varsigma_{\gamma} \gamma + \varsigma_{\vartheta} \int^{\vartheta^{*}} \vartheta d\mathcal{F}(\vartheta)$$

$$\iota(\boldsymbol{x}) = \chi \boldsymbol{x} + \frac{\kappa}{2} \left( \boldsymbol{x} - \tilde{\boldsymbol{x}} \right)^{2} \quad \iota_{r}(\boldsymbol{x}_{r}) = \chi \boldsymbol{x}_{r} + \frac{\kappa_{r}}{2} \left( \boldsymbol{x}_{r} - \tilde{\boldsymbol{x}}_{r} \right)^{2}$$

$$\mathcal{J}(\boldsymbol{w}, \mathbf{s}) = \max_{\vartheta^{*}} \int^{\gamma^{*}} J(\boldsymbol{w}, \gamma, \mathbf{s}) d\mathcal{G}(\gamma)$$

#### Hiring and Recall (at non-exiting firms w/ policy $\vartheta^*$ )

► FOC's for hiring and recall:

$$\chi + \kappa \left( \mathbf{X} - \tilde{\mathbf{X}} \right) = \mathbb{E} \left\{ \Lambda(\mathbf{S}, \mathbf{S}') \mathcal{J} \left( \mathbf{W}', \mathbf{S}' \right) | \mathbf{W}, \mathbf{S} \right\}$$
$$\chi + \kappa_r \left( \mathbf{X}_r - \tilde{\mathbf{X}}_r \right) = \mathbb{E} \left\{ \Lambda(\mathbf{S}, \mathbf{S}') \mathcal{J} \left( \mathbf{W}', \mathbf{S}' \right) | \mathbf{W}, \mathbf{S} \right\}$$

Calibrated model (and data):

$$\underbrace{\left(\frac{\chi_r}{\kappa_r \tilde{\mathbf{X}}_r}\right)}_{\text{Recall elasticity}} > \underbrace{\left(\frac{\chi}{\kappa \tilde{\mathbf{X}}}\right)}_{\text{Hiring elasticity}}$$

▶ Relation of  $\{x, x_r\}$  to job-finding/recall probabilities  $\{p, p_r\}$ :

$$\mathbf{x} = \frac{\mathbf{p}\mathbf{u}_{JL}}{\mathcal{F}(\vartheta^*)\mathbf{n}}, \quad \mathbf{x}_r = \frac{\mathbf{p}_r\mathbf{u}_{TL}}{\mathcal{F}(\vartheta^*)\mathbf{n}}$$

#### Firm Exits (and Temporary Paycuts)

- ightharpoonup Given cost shock  $\gamma$  and base wage w, allow temp. paycuts to avoid exit
- ► Shutdown threshold  $\gamma^*$  solves  $J(\underline{w}, \gamma^*, \mathbf{s}) = 0$ 
  - ightharpoonup  $\equiv$  reservation wage
- Paycut threshold  $\gamma^{\dagger} \in (0, \gamma^*)$  solves  $J(w, \gamma^{\dagger}, \mathbf{s}) = 0$ 
  - ► Zero firm surplus for  $\gamma \in (\gamma^{\dagger}, \gamma^{*})$
- Firm's active laborforce + workers on TL go to  $u_{JL}$  upon exit

#### Temporary layoffs

Firm must pay overhead costs to continue to operate:

$$\varsigma(\gamma, \vartheta^*) = \varsigma_\gamma \gamma + \varsigma_\vartheta \int^{\vartheta^*} \vartheta d\mathcal{F}(\vartheta)$$

▶ FOC for optimal  $\theta^*$  determines TL threshold:

$$\underbrace{\mathcal{J}(\mathbf{w}, \mathbf{s}) + \varsigma_{\gamma}\Gamma + \varsigma_{\vartheta}\mathcal{G}\left(\gamma^{*}\right) \Theta}_{\text{Job value net of period overhead costs}} = \varsigma_{\vartheta}\vartheta^{*}\mathcal{F}(\vartheta^{*})\mathcal{G}\left(\gamma^{*}\right)$$

with 
$$\Gamma \equiv \int^{\gamma^*} \gamma d\mathcal{G}(\gamma)$$
 and  $\Theta \equiv \int^{\vartheta^*} \vartheta d\mathcal{F}(\vartheta)$ .

## Model Evaluation

#### **Calibration**

- Calibrate model to match standard labor market stocks and flows...
  - Plus characteristics of temporary layoff, recall, and loss-of-recall
- Nested, two-stage estimation of 16 parameters
  - Inner loop: long-run moments
  - Outer loop: business cycle features

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▶ Parameters and moments
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- Where we tie our hands:
  - Not a small-surplus calibration
  - Wage rigidity to match evidence on contract duration
  - Temporary paycuts can undo wage rigidity
- Model does well!





► Loss-of-Recall

Application to the Covid-19

Recession

#### Adapting the Model to the Covid-19 Recession

- Introduce two shocks:
  - "Lockdown" shocks: workers move to lockdown-TL (MIT shock)
  - Persistent shocks to effective TFP w/ each wave (social distancing)
- Add two parameters specific to workers on lockdown-TL:
  - Allow for different recall cost (vs. TL)
  - Allow for different rate for loss-of-recall (vs. TL)
- Treatment of PPP:
  - Direct factor payment subsidy, à la Kaplan, Moll, Violante (2020)
  - Pre-announcement: program is unexpected
  - Post-announcement: availability of funds is known
- Estimate shocks and parameters to match stocks and flows
  - Model does well!

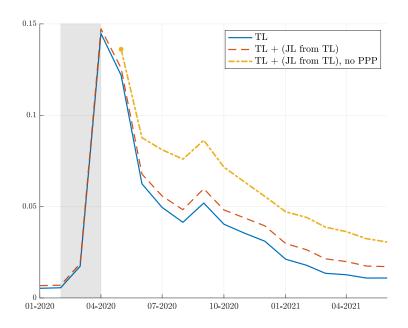


#### No-PPP Counterfactual

- Q: What did PPP do?
  - Keep decision rules, parameters, and shocks, but remove PPP
- A: Save a lot of worker/job matches!
  - ▶ Average monthly empl. gains of  $\approx$  2.14 p.p. in first 6 months
  - Doubles number of recalls over the same period
  - Achieved through reduction of loss-of-recall



#### Counterfactual: JL-from-TL without PPP





#### **Concluding Remarks**

#### Two Directions for Further Work

- 1. Match-specific capital
  - Recalls preserve match-specific capital
  - Thus, interesting to consider heterogenous match quality

#### 2. Reallocation

- Evidence that smaller firms benefited more from PPP
- ▶ PPP might have hindered efficient reallocation

# **Supplementary Slides**

#### Estimating JL-from-TL

Use accumulation equations:

$$u_{JL\text{-from-}TL,t} = \sum_{j=0}^{T} e'_{JL} \mathbf{x}_{t-j-1,t}$$

where  $x_{t-j-1,t}$  is the distribution of workers at time t whose last exit from employment was for  $u_{TL}$  at time t-j-1, s.t.

$$X_{t-m,t-j} = \tilde{P}_t X_{t-m,t-j-1}$$
  
 $X_{t-m,t-m} = e_{TL} \cdot (n_{t-m-1}^E \cdot p_{t-m}^{E,TL})$ 

- Relatively small:  $u_{JL-from-TL}$  is 40% of  $u_{TL}$
- ▶ Highly volatile: twice as volatile as total unemployment,  $16 \times$  as GDP

# Model: Full Slides

#### Searchers, Matching and Recalls

- Jobless unemployment (DMP matching market)
  - New hires *m* from unemployment

$$m = \sigma_m(u_{JL})^{\sigma}(v)^{1-\sigma}$$

 $\triangleright$  Job finding and hiring probabilities p and q, hiring rate x

$$p = \frac{m}{u_{JL}}, \quad q = \frac{m}{v}, \quad x = \frac{p \cdot u_{JL}}{\mathcal{F}(\vartheta^*)n} = \frac{q \cdot v}{\mathcal{F}(\vartheta^*)n}$$

- ► Temporary-layoff unemployment
  - $\triangleright$  Recalls  $m_r$  from TL unemp., recall hiring rate  $x_r$

$$m_r = p_r u_{TL}, \quad x_r = \frac{p_r u_{TL}}{\mathcal{F}(\vartheta^*) n}$$

- ▶ Workers in  $u_{TL}$  move to  $u_{JL}$  with exog. probability  $1 \rho_r$ 
  - or if firm exits (with prob.  $1 \mathcal{G}(\gamma^*)$ )

#### Firms (or plants, shifts, production unit, etc.)

- Firms are "large", i.e hire a continuum of workers
  - Firm, or establishment, or assembly line, etc.
- CRS technology
  - $ightharpoonup n \equiv$  beginning of period employment
  - $ightharpoonup \mathcal{F} \equiv$  fraction of workers not on temporary layoff
  - $\triangleright$   $\xi_k, \xi_n \equiv$  factor utilization rates

$$y = \check{z}(\xi_k k)^{\alpha}(\xi_n \mathcal{F} n)^{1-\alpha}$$
$$= zk^{\alpha}(\mathcal{F} n)^{1-\alpha}$$

Given CRS technology, firm decisions scale independent

#### Overhead Costs: Temporary versus Permanent Layoffs

- $\gamma \equiv i.i.d$  firm specific cost shock
- $\vartheta \equiv i.i.d.$  worker-specific cost shock
  - Non-exiting firms ( $\gamma < \gamma^*$ ) pay overhead costs to operate:

$$\varsigma(\gamma, \vartheta^*) n = \left[ \varsigma_{\gamma} \gamma + \varsigma_{\vartheta} \int^{\vartheta^*} \vartheta d\mathcal{F}(\vartheta) \right] n$$

$$\mathcal{F}(\vartheta^*) = \Pr\{\vartheta \leq \vartheta^*\} \qquad \mathcal{G}(\gamma^*) = \Pr\{\gamma \leq \gamma^*\}$$

- ▶ Temporary layoff: each worker draws  $\vartheta$ 
  - ▶ Workers w/  $\vartheta \ge \vartheta^*$  (endog. thresh.) go on temporary layoff
- ightharpoonup Permanent layoff: firms draws  $\gamma$ 
  - Firm operates if  $\gamma < \gamma^*$  (endog. thresh.); otherwise exits

#### **Timing of Events**

- 1. Firm enters period with stock of workers *n*
- 2. Aggregate & worker-specific shocks revealed
- 3. Firms and workers bargain over base wages w
- 4. Firms assigns  $1 \mathcal{F}(\vartheta^*)$  workers to temporary layoff,
- 5. Firm-specific shock  $\gamma$  revealed
  - ▶ If  $\gamma \ge \gamma^*$  → firm exits, workers move to  $u_{JL}$ 
    - Firm's workers in  $u_{TL}$  move to  $u_{JL}$
  - ▶ If  $\gamma < \gamma^* \rightarrow$  firm continues
    - Rents capital and produces output
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#### Solve backwards

#### Behind the Timing

- Timing accomplishes the following:
  - 1. Temporary layoff policy  $\vartheta^*$  independent of  $\gamma$ 
    - Tractability
  - 2. Base wages are independent of  $\gamma$ 
    - Tractability
  - 3. Firm cannot cut wages to avoid temporary layoffs
    - Consistent with data
- $\blacktriangleright$  (1) and (2) achieved by mid-period realization of  $\gamma$
- (3) achieved by separation of temporary layoffs and bargaining

# Firm Problem (at non-exiting firms w/ TL policy $\vartheta^*$ )

$$J(\boldsymbol{w}, \gamma, \mathbf{s}) = \max_{\boldsymbol{k}, \boldsymbol{x}, \boldsymbol{x}_r} \left\{ z \mathcal{F}(\vartheta^*) \boldsymbol{\check{k}}^{\alpha} - \omega \left( \boldsymbol{w}, \gamma, \mathbf{s} \right) \mathcal{F}(\vartheta^*) - r \mathcal{F}(\vartheta^*) \boldsymbol{\check{k}} \right.$$

$$\left. - \left( \iota(\boldsymbol{x}) \mathcal{F}(\vartheta^*) + \iota_r(\boldsymbol{x}_r) \mathcal{F}(\vartheta^*) \right) - \varsigma(\vartheta^*, \gamma) \right.$$

$$\left. + \mathbb{E} \left\{ \Lambda(\mathbf{s}, \mathbf{s}') \mathcal{J}(\boldsymbol{w}', \mathbf{s}') |, \boldsymbol{w}, \mathbf{s} \right\} \right\},$$

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$$\mathcal{J}(\boldsymbol{w}, \mathbf{s}) = \max_{\vartheta^*} \int_{\vartheta^*} \mathcal{J}(\boldsymbol{w}, \gamma, \mathbf{s}) d\mathcal{G}(\gamma),$$

with

#### Hiring Conditions (at non-exiting firms w/ policy $\vartheta^*$ )

▶ Let  $J(w, \gamma) \equiv F(n, w, \gamma) / n$  be the firm value per worker

$$\chi + \kappa \left( \mathbf{X} - \tilde{\mathbf{X}} \right) = \mathbb{E} \left\{ \Lambda(\mathbf{s}, \mathbf{s}') \mathcal{J} \left( \mathbf{w}', \mathbf{s}' \right) | \mathbf{w}, \mathbf{s} \right\}$$
$$\chi + \kappa_r \left( \mathbf{X}_r - \tilde{\mathbf{X}}_r \right) = \mathbb{E} \left\{ \Lambda(\mathbf{s}, \mathbf{s}') \mathcal{J} \left( \mathbf{w}', \mathbf{s}' \right) | \mathbf{w}, \mathbf{s} \right\}$$

- $\blacktriangleright$   $\frac{\chi}{\kappa x}, \frac{\chi}{\kappa_r x_r} \equiv$  elasticities of  $x, x_r$  w/r.t. J
- ▶ Link between  $x_r$  and recall rate  $p_r$ :  $x_r = \frac{p_r u_{T_L}}{\mathcal{F}(\vartheta^*)n}$

#### **Temporary Layoffs**

- ► Temporary layoffs =  $(1 \mathcal{F}(\vartheta^*))\mathcal{G}(\gamma^*)n$
- ► TL threshold  $\vartheta^*$  maximizes  $\int^{\gamma^*} J(w, \gamma, \mathbf{s}) d\mathcal{G}(\gamma)$ :

$$\mathcal{J}(\mathbf{w}, \mathbf{s}) + \varsigma_{\gamma} \Gamma + \varsigma_{\vartheta} \mathcal{G}(\gamma^*) \Theta = \varsigma_{\vartheta} \vartheta^* \mathcal{F}(\vartheta^*) \mathcal{G}(\gamma^*)$$

where 
$$\Gamma = \int^{\gamma^*} \gamma d\mathcal{G}(\gamma)$$
 and  $\Theta = \int^{\theta^*} \theta d\mathcal{F}(\theta)$ 

#### Shutdowns (permanent layoffs)

- ▶ Permanent separations from employment =  $(1 \mathcal{G}(\gamma^*))n$
- ▶ Shutdown threshold  $\gamma^*$  solves

$$J(\underline{w}, \gamma^*, \mathbf{s}) = 0$$

with  $\underline{w} \equiv \text{reservation wage}$ 

Paycut threshold  $\gamma^{\dagger} \in (0, \gamma^*)$  solves

$$J(\mathbf{w}, \gamma^{\dagger}, \mathbf{s}) = 0$$

Paycuts for  $\gamma \in (\gamma^{\dagger}, \gamma^*)$  (firm gets 0 surplus in this region)

#### Workers (1/2)

Value of work

$$V(\mathbf{w}, \gamma, \mathbf{s}) = \omega(\mathbf{w}, \gamma, \mathbf{s}) + \mathbb{E}\left\{\Lambda(\mathbf{s}, \mathbf{s}') \mathcal{V}(\mathbf{w}', \mathbf{s}') | \mathbf{w}, \mathbf{s}\right\},$$

with

$$egin{aligned} \mathcal{V}(oldsymbol{w}, oldsymbol{s}) &= \mathcal{F}(artheta^*) \left[ \int^{\gamma^*} V\left(oldsymbol{w}, \gamma, oldsymbol{s}
ight) d\mathcal{G}(\gamma) + \left(1 - \mathcal{G}(\gamma^*)\right) U_{JL}(oldsymbol{s}) 
ight] \ &+ \left(1 - \mathcal{F}(artheta^*)
ight) \mathcal{U}_{TL}(oldsymbol{w}, oldsymbol{s}) \end{aligned}$$

#### where

- $ightharpoonup U_{JL}(\mathbf{s})$  is the value of jobless unemployment
- $\triangleright$   $\mathcal{U}_{TL}$  is the expected value of temporary-layoff unemployment
- $\blacktriangleright \ \omega(\mathbf{w}, \gamma, \mathbf{s})$  are remitted wages

#### Workers (2/2)

Value of jobless unemployment

$$U_{JL}(\mathbf{s}) = b + \mathbb{E}\left\{\Lambda\left(\mathbf{s}, \mathbf{s}'\right) \left[\rho \bar{V}_{X}\left(\mathbf{s}'\right) + (1-\rho) U_{JL}\left(\mathbf{s}'\right)\right] | \mathbf{s} \right\}$$
 where  $\bar{V}_{X}$  is the expected value of being a new hire

Value of temporary-layoff unemployment

$$egin{aligned} U_{TL}(oldsymbol{w},oldsymbol{s}) &= b + \mathbb{E}\left\{\Lambda\left(oldsymbol{s},oldsymbol{s}'
ight)\left[
ho_{r}\mathcal{V}\left(oldsymbol{w}',oldsymbol{s}'
ight) \\ &+ \left(1-
ho_{r}
ight)
ho_{r}\mathcal{U}_{TL}\left(oldsymbol{w}',oldsymbol{s}'
ight) \\ &+ \left(1-
ho_{r}
ight)\left(1-
ho_{r}
ight)\mathcal{U}_{JL}\left(oldsymbol{s}'
ight)
ight]\left|oldsymbol{w},oldsymbol{s}
ight\}. \end{aligned}$$

with

$$\mathcal{U}_{TL}(\mathbf{w},\mathbf{s}) = \mathcal{G}\left(\gamma^*\right) U_{TL}\left(\mathbf{w},\mathbf{s}\right) + \left(1 - \mathcal{G}(\gamma^*)\right) U_{JL}(\mathbf{s})$$
.

#### Staggered Nash Wage Bargaining

- **Each** period, probability  $1 \lambda$  of renegotiating base wage
- ightharpoonup Parties bargain over surpluses prior to realization of  $\gamma$ 
  - ▶ Worker surplus:  $\mathcal{H}(w, \mathbf{s}) \equiv \mathcal{V}(w, \mathbf{s}) U_{\mathcal{H}}(\mathbf{s})$
  - Firm surplus:  $\mathcal{J}(w, \mathbf{s}) \equiv \max_{\vartheta^*} \int^{\gamma^*} J(w, \mathbf{s}) d\mathcal{G}(\gamma)$
- Contract wage w\* solves

$$\max_{\mathbf{w}^*} \mathcal{H}(\mathbf{w}, \mathbf{s})^{\eta} \mathcal{J}(\mathbf{w}, \mathbf{s})^{1-\eta}$$

subject to

$$w' = \begin{cases} w \text{ with probability } \lambda \\ w^{*'} \text{ with probability } 1 - \lambda \end{cases}$$

and to wage cut policy

# Model Evaluation: Full Slides

# Calibration: Assigned Parameters

Parameter values			
Discount factor	β	$0.997 = 0.99^{1/3}$	
Capital depreciation rate	$\delta$	0.008 = 0.025/3	
Production function parameter	$\alpha$	0.33	
Autoregressive parameter, TFP	$ ho_{z}$	$0.99^{1/3}$	
Standard deviation, TFP	$\sigma_{z}$	0.007	
Elasticity of matches to searchers	$\sigma$	0.5	
Bargaining power parameter	$\eta$	0.5	
Matching function constant	$\sigma_{\it m}$	1.0	
Renegotiation frequency	λ	8/9 (3 quarters)	

# Calibration: Estimated Parameters (inner loop)

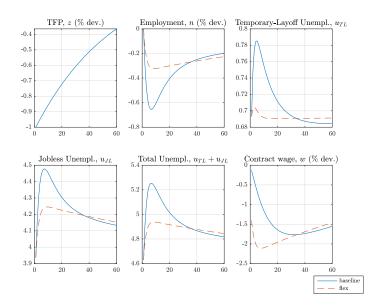
Parameter	Description	Value	Target
$\overline{\chi}$	Scale, hiring costs	1.0567	Average JL, E rate (0.304)
$arsigma_{artheta}\cdot oldsymbol{e}^{\mu_{artheta}}$	Scale, overhead costs, worker	0.0893	Average $E$ , $TL$ rate (0.005)
$arsigma_{\gamma}\cdot oldsymbol{e}^{\mu_{\gamma}}$	Scale, overhead costs, firm	2.0097	Average $E$ , $JL$ rate (0.011)
$1- ho_r$	Loss of recall rate	0.3925	Average TL, JL rate (0.210)
b	Flow value of unemp.	0.8848	Rel. value non-work (0.71)

# Calibration: Estimated Parameters (outer loop)

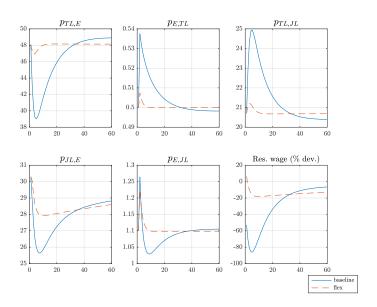
Parameter	Description	Value
$\chi/(\kappa \tilde{x})$	Hiring elasticity, new hires	0.3942
$\chi/(\kappa_r \tilde{x}_r)$	Hiring elasticity, recalls	0.8912
$\sigma_{artheta}$	Parameter lognormal ${\mathcal F}$	1.4140
$\sigma_{\gamma}$	Parameter lognormal ${\cal G}$	0.3215

Moment	Target	Model
SD of hiring rate	3.304	3.253
SD of total separation rate	6.620	4.707
SD of temporary-layoff unemployment, $u_{TL}$	10.906	10.969
SD of jobless unemployment, $u_{JL}$	8.532	10.519
SD of hiring rate from $u_{JL}$ relative to	0.445	0.442
SD of recall hiring rate from $u_{TL}$		

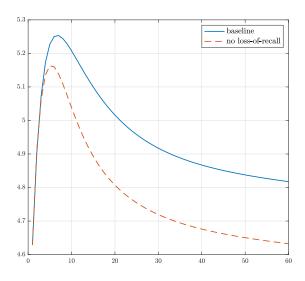
#### TFP Shock: Employment, Unemployment and Wages



#### **TFP Shock: Transition Probabilities**



# TFP Shock: Shut off $u_{JL}$ from $u_{TL}$



Application to PPP: Full Slides

#### Adapting the Model to the Covid-19 Recession

Introduce series of shocks and two parameters

#### 1. Shocks:

- "Lockdown" shocks
  - ▶ Beginning of period: fraction  $1 \nu$  move to TL unemp
  - Unanticipated (MIT shock)
- Utilization restrictions on capital and labor
  - Transitory shock at start of pandemic
  - New persistent shock with each Covid wave
- PPP as factor payment subsidy (as in KMV)
  - ▶ PPP 2020: 12.5% of quarterly GDP, most payments May-July 2020
  - PPP 2021: 5.4% of quarterly GDP, most payments Jan-April 2021

#### Adapting the Model to the Covid-19 Recession, cont.

• • •

#### 2. Two parameters:

(Possibly) reduced recall costs for workers in lockdown

$$\chi x_r + \frac{\kappa_r}{2} \left( x_r - \xi \underbrace{\frac{(1-\phi)u_{TL}}{\mathcal{F}(\vartheta^*)n}}_{\text{Workers on lockdown}} - \tilde{x}_r \right)^2$$

- $ightharpoonup 0 \le \xi \le 1$
- ▶ Different rate of exog. TL-to-JL for workers on lockdown,  $\rho_{r\phi}$

#### **Recession Experiment**

- ► Thus, need to estimate:
  - 1. Lockdown shocks for each month of pandemic (+T)
  - 2. Size of transitory utilization shock at onset of pandemic (+1)
  - 3. Size of persistent utilization shock for three waves (+3)
  - 4. Autoregressive parameter of persistent utilization shock (+1)
  - 5. Two model parameters (+2)
- Moments to match:
  - 1. Stocks:  $\{u_{TL}, u_{JL}\}_{\tau}$  since onset of pandemic
  - 2. Gross flows:  $\{g_{E,TL}, g_{TL,E}, g_{TL,JL}\}_{\tau}$  since onset
  - 3. Inflows into  $u_{JL}$ : March-April 2020 only
    - To discipline size of transitory shock

#### Recession Experiment, cont.

- Estimate by SMM:
  - T months of pandemic w/ 3 waves (for now)
    - $\triangleright$  (5 · T + 1) moments to match
    - ightharpoonup (T+7) parameters to estimate
  - System is highly overidentified

#### Parameter and Shock Estimates

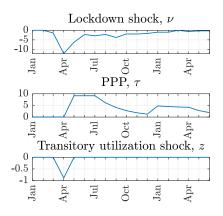
#### **Parameters**

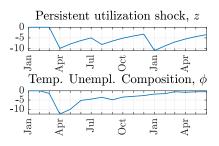
Variable	Description	Value
$ ho_{Z}$	Autoregressive coefficient for persistent utilization shocks	0.7651
ξ	Adjustment costs for workers on lockdown	0.4988
$1- ho_{r\phi}$	Probability of exogenous loss of recall for workers in temporary unemployment	0.6329

#### Shocks

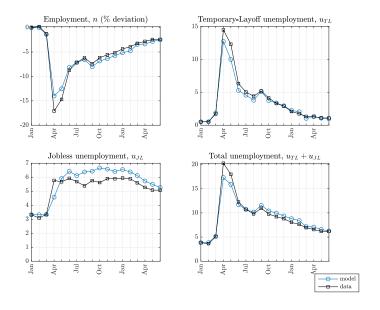
Description	Value
Persistent utilization shock, April 2020	-10.28%
Transitory utilization shock, April 2020	-0.90%
Persistent utilization shock, September 2020	-4.23%
Persistent utilization shock, January 2021	-9.56%

#### Parameter and Shock Estimates, cont.

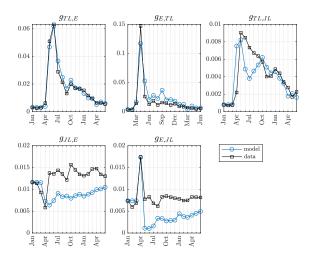




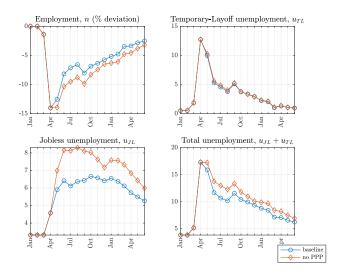
#### Covid Onset, Stocks



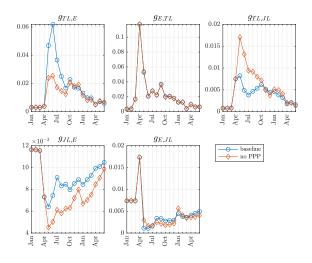
#### Covid Onset, Gross Flows



# Policy Counterfactual: No PPP, stocks



# Policy Counterfactual: No PPP, flows



#### PPP takeaway

- PPP achieved sizeable employment gains
- Immediate term: May to September 2020
  - Achieved average monthly employment gains of 2.14%
  - Doubled cumulative recalls
- Longer term
  - Smaller persistent employment gains
  - Avg. monthly empl. at least 1% higher through May 2021
- Employment gains came from recalls
  - ▶ PPP preserved ties btwn firms and workers in  $u_{TL}$
  - Fulfilled mandate