## How much work experience do you need to get your first job? The macroeconomic implications of bias against labor market entrants

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# Motivation I

A vicious circle (meme found in social media)...

life after college



### Motivation II

- The first step in a worker's career often is particularly hard
  - ▶ Job-finding rate for entrants is roughly half of the other unemployed UFRs
  - 35% of entry level positions posted since 2017 on LinkedIn require minimum three years of experience
  - 43% of college graduates start their career with a job that does not require a college degree
- All workers in the economy begin their career as labor market entrants
- Large literature documents that early-career shocks have long-lasting effects (von Wachter, 2020)
- Questions:
  - 1. What are the aggregate implications of firms' preference for experienced workers?
  - 2. Is there room for welfare-improving government interventions?

### What we do

- Build a DMP model with entrants and experienced workers
  - Firms that hire new workers have to incur training expenses
  - New workers who stay unemployed for an extended time period suffer skill loss
- Ranking: firms prefer hiring experienced over new workers to avoid training costs
- Trade off: the bias against new workers increases their unemployment duration and persistently lowers their productivity due to skill loss
- Use a calibrated version of the model to quantitatively study various governments interventions/labor market institutions

### What we find

- Four interventions
  - Ranking ban
  - Government subsidizes training costs from tax revenues
  - ► Internships: exogenous wages for entrants
  - Government subsidizes hiring of entrants only
- Ranking equilibrium features lower welfare than all interventions
  - Interventions increase aggregate unemployment and make firms incur larger training costs
  - Still higher welfare because they lower entrant's unemployment and save them from persistent skill losses
- Internships are welfare-enhancing
  - Exact effect depends on the magnitude of the exogenous wage
  - ▶ Inverse U-shape with max welfare at 85% of experienced workers' wage
- Government subsidy of entrants' hiring has the largest welfare gains
  - Directly confronts the issue of entrants' long unemployment duration
  - Rationalizes policies that explicitly target young workers (e.g., Youth Employment Initiative)

#### Literature

- Skill loss in unemployment: Pissarides (1992); Ljungqvist and Sargent (1998);
   Coles and Masters (2000); Ortego Marti (2016, 2017); Flemming (2020);
   Kospentaris (2021); Laureys (2021); Walentin and Westermark (2022); Baley,
   Ljungqvist and Sargent (2022)
- Ranking: Lockwood (1991); Blanchard and Diamond (1994); Petrongolo and Pissarides (2001); Gonzalez and Shi (2010); Pallais (2014); Fernandez-Blanco and Preugschat (2018); Doppelt (2016); Jarosch and Pilossoph (2019)
- Training and Institutions: Becker (1964); Acemoglu and Pischke (1998, 1999);
   Autor (2001); Leuven (2005); Boeri (2011); Masui (2022)

### The model

- Continuous time, infinite horizon; discount rate r
- Labor force is normalized to 1, homogeneous workers
- Workers retire (exit) at Poisson rate  $\delta$ ;
  - ▶ a retired worker is immediately replaced by a new worker (an inexperienced entrant)
- · New workers enter the labor market as unemployed
- A large number of homogeneous firms
  - measure of active firms determined by free entry

### Entry, production, unemployment benefits

- Firms open one vacancy and search for workers; workers search for firms
- ullet Firms pay a standard entry or recruiting cost c
- ullet Existing jobs get terminated at the job destruction rate  $\lambda$
- ullet All matches produce an amount p of the numeraire good
- Workers and firms negotiate over the wage
  - lacktriangle Nash Bargaining where  $\eta$  denotes the bargaining power of the worker
- $\bullet$  Unemployed workers enjoy an unemployment benefit z < p

## Bias against new workers

- The "story" here is that new/inexperienced workers must be trained to become productive workers
- Firms that hire them first must pay flow training cost  $\kappa$  until the match dissolves
  - After losing their first job workers become experienced
- Firms prefer trained to untrained: Petrongolo-Pissarides (2001) generalization of the Blanchard-Diamond (1994) matching process with bias
- Similar to the outcome of an urn-ball process
  - A firm receiving multiple applications chooses experienced over inexperienced
  - ▶ But a firm receiving applications only from inexperienced workers will hire one

# Bias against new workers: "matching with ranking"

- What does it mean that "firms are biased against inexperienced workers"?
  - ► (And even more biased against inexperienced workers who have suffered skill loss?)
- Matching with ranking; the matching rate for experienced workers is

$$f_1 = \frac{m(u_1, v)}{u_1}$$

• The matching rate for inexperienced workers is

$$f_0 = \frac{m(u_0 + u_1, v) - m(u_1, v)}{u_0}$$

- It's like type 1 workers "move first"; only then type 0 workers get a chance
- In our model the heterogeneity is richer (4 unemployed types)
  - ▶ But this simple idea can be applied to as many types as one likes

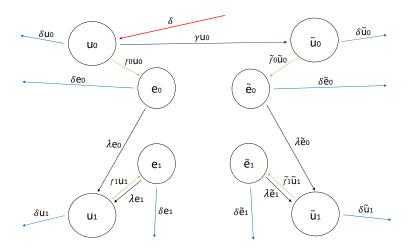
### Skill loss and types of workers in the various states

- A new worker who stays unemployed for a long time is at risk of skill loss
  - ightharpoonup This happens at rate  $\gamma$
- ullet The productivity of workers who have suffered skill loss decreases by  $ilde{\kappa}$
- $2^3=8$  worker types: employed vs unemployed, experienced vs inexperienced, scarred vs non-scarred
  - u<sub>0</sub> : Inexperienced Unemployed
  - $ightharpoonup ilde{u}_0$  : Inexperienced Unemployed who has also suffered skill loss
  - ▶ e<sub>1</sub> : Experienced Employed
  - $ightharpoonup ilde{e}_1$ : Experienced Employed who suffered skill loss during youth
  - And so on

#### Quick comment on notation

- The previous notation applies to other variables too
  - $\blacktriangleright~\{0,1\}$  refers to experience; "tilde" means skill loss
- ullet E.g.,  $ilde{f}_0$  is the job finding rate of an inexperienced worker who suffered skill loss
- ullet  $ilde{f}_1$  is the job finding rate of an experienced worker who suffered skill loss at youth
- $w_0$  is the wage of an inexperienced worker (without skill loss)
- ullet  $u_1$  is the measure of experienced (non-scarred) unemployed workers
- And so on...

# **Employment states**



#### Beveridge curves

#### **Equating inflows and outflows:**

$$u_{0} = \frac{\delta}{\delta + \gamma + f_{0}}$$

$$\tilde{u}_{0} = \frac{\gamma}{\delta + \tilde{f}_{0}} \cdot \frac{\delta}{\delta + \gamma + f_{0}}$$

$$e_{0} = \frac{f_{0}}{\delta + \lambda} \cdot \frac{\delta}{\delta + \gamma + f_{0}}$$

$$\tilde{e}_{0} = \frac{\tilde{f}_{0}}{\delta + \lambda} \cdot \frac{\gamma}{\delta + \tilde{f}_{0}} \cdot \frac{\delta}{\delta + \gamma + f_{0}}$$

$$u_{1} = \frac{\lambda f_{0}}{(\gamma + \delta + f_{0})(\delta + \lambda + f_{1})}$$

$$e_{1} = \frac{f_{1}}{\delta + \lambda} \cdot \frac{\lambda f_{0}}{(\gamma + \delta + f_{0})(\delta + \lambda + f_{1})}$$

$$\tilde{u}_{1} = \frac{\lambda \gamma \tilde{f}_{0}}{(\delta + \tilde{f}_{0})(\gamma + \delta + f_{0})(\delta + \lambda + \tilde{f}_{1})}$$

$$\tilde{e}_{1} = \frac{\tilde{f}_{1} \lambda \gamma \tilde{f}_{0}}{(\delta + \lambda)(\delta + \tilde{f}_{0})(\gamma + \delta + f_{0})(\delta + \lambda + \tilde{f}_{1})}$$

### Firms' value functions

• Free Entry/ Job Creation:

$$c = q_0 J_0 + \tilde{q}_0 \tilde{J}_0 + q_1 J_1 + \tilde{q}_1 \tilde{J}_1$$

Values of employing different workers

$$rJ_0 = p - \kappa - w_0 - (\lambda + \delta)J_0$$
  

$$r\tilde{J}_0 = p - \kappa - \tilde{\kappa} - \tilde{w}_0 - (\lambda + \delta)\tilde{J}_0$$
  

$$rJ_1 = p - w_1 - (\lambda + \delta)J_1$$
  

$$r\tilde{J}_1 = p - \tilde{\kappa} - \tilde{w}_1 - (\lambda + \delta)\tilde{J}_1$$

## Workers' value functions

#### Employed

$$\begin{split} rW_0 &= w_0 + \lambda(U_1 - W_0) - \delta W_0 \\ rW_1 &= w_1 + \lambda(U_1 - W_1) - \delta W_1 \\ r\tilde{W}_0 &= \tilde{w}_0 + \lambda(\tilde{U}_1 - \tilde{W}_0) - \delta \tilde{W}_0 \\ r\tilde{W}_1 &= \tilde{w}_1 + \lambda(\tilde{U}_1 - \tilde{W}_1) - \delta \tilde{W}_1 \end{split}$$

#### Unemployed

$$rU_{0} = z + f_{0}(W_{0} - U_{0}) + \gamma(\tilde{U}_{0} - U_{0}) - \delta U_{0}$$

$$r\tilde{U}_{0} = z + \tilde{f}_{0}(\tilde{W}_{0} - \tilde{U}_{0}) - \delta \tilde{U}_{0}$$

$$rU_{1} = z + f_{1}(W_{1} - U_{1}) - \delta U_{1}$$

$$r\tilde{U}_{1} = z + \tilde{f}_{1}(\tilde{W}_{1} - \tilde{U}_{1}) - \delta \tilde{U}_{1}$$

# Bargaining I

Bargaining in type 1 meeting

$$(1-\eta)(W_1-U_1) = \eta J_1 \implies w_1 = \frac{\eta p(r+\lambda+\delta+f_1) + (1-\eta)z(r+\lambda+\delta)}{r+\lambda+\delta+\eta f_1}$$

ullet Bargaining in type  $ilde{1}$  meeting

$$(1-\eta)(\tilde{W}_1 - \tilde{U}_1) = \eta \tilde{J}_1 \implies \tilde{w}_1 = \frac{\eta(p-\tilde{\kappa})(r+\lambda+\delta+\tilde{f}_1) + (1-\eta)z(r+\lambda+\delta)}{r+\lambda+\delta+\eta \tilde{f}_1}$$

• Bargaining in type  $\tilde{0}$  meeting

$$(1-\eta)(\tilde{W}_0 - \tilde{U}_0) = \eta \tilde{J}_0 \implies \tilde{w}_0 = \frac{1}{r+\delta+\eta \tilde{f}_0} \left[ \eta(p-\kappa-\tilde{\kappa})(r+\delta+\tilde{f}_0) + \right. \\ \left. + (1-\eta)z \frac{(r+\delta+\lambda)(r+\delta+\tilde{f}_1)}{r+\delta+\lambda+\tilde{f}_1} - \frac{\lambda(1-\eta)\tilde{f}_1}{r+\delta+\lambda+\tilde{f}_1} \tilde{w}_1 \right]$$

## Bargaining II

Bargaining in type 0 meeting

$$(1-\eta)(W_0 - U_0) = \eta J_0 \implies w_0 = \frac{r+\delta+\gamma+f_0}{r+\delta+\gamma+\eta f_0} \eta(p-\kappa) + \frac{(r+\lambda+\delta)(r+f_1+\delta)(r+\gamma+\delta)}{(r+\delta)(r+\delta+\gamma+\eta f_0)(r+\lambda+\delta+f_1)} (1-\eta)z + \frac{\gamma \tilde{f}_0}{(r+\delta)(r+\delta+\gamma+\eta f_0)} \eta(p-\kappa-\tilde{\kappa}-\tilde{w}_0) - \frac{(1-\eta)\lambda f_1(r+\gamma+\delta)w_1}{(r+\delta)(r+\delta+\gamma+\eta f_0)(r+\lambda+\delta+f_1)}$$

• Notice that  $w_1$  enters negatively: new workers are willing to accept a lower wage to get access to their first job and a higher continuation value

## Early-career skill loss

- Initial labor market conditions have persistent effects on young adults' earnings for 10-15 years (von Wachter, 2020)
- Two recent studies focus on new workers:
  - Arellano-Bover (2022): workers who faced higher unemployment rates at ages 18 to 25 have lower skills at ages 36 to 59
  - Dinerstein, Megalokonomou and Yannelis (2022): show negative effects of the length of unemployment on teachers' performance measured by students' test scores
- • To translate this into wages we use Ortego Marti's (2016, 2017) estimates assuming  $\gamma=1/6$

### More data

- Monthly CPS data 1994-2020
  - Average unemployment rate: 5.8%
  - Fraction of entrants in the unemployment pool: 9%
  - Fraction of LTU in the entrant pool: 28%
- Various surveys for training costs
  - Training Industry Report: \$1,075 in 2017, \$1,071 in 2021
  - Association for talent development: \$1,252 in 2016
  - Masui (2022) calibrates them at a value comparable to vacancy costs
- We set a target of \$1,000 2017 dollars which results in 0.8% of GDP
  - Vacancy costs are estimated 1-2% of GDP in the literature
- Finally, we use Hall and Milgrom's (2008) 71% for  $z/\mathbb{E}(p)$  (midpoint of Chodorow-Reich and Karabarbounis, 2016)

# Parameter values

Parameter	Description	Value
p	Productivity	1
r	Interest Rate	0.0042
$\alpha$	Matching Elasticity	0.72
$\eta$	Worker Bargaining Power	0.72
$\gamma$	Skill Loss Rate	1/6
δ	Worker Exit Rate	0.0023
$\lambda$	Separation Rate	0.0341
c	Vacancy Cost	1.71
z	Unemployment Value	0.65
$\kappa$	Training Cost	0.11
$ ilde{\kappa}$	Skill Loss Scar	0.07

# Policy interventions

- 1. Ranking is not allowed by government regulation
  - ▶ Standard DMP with heterogeneous workers in a common labor market
- 2. Government subsidizes firms to cover for training costs and skill loss
  - ightharpoonup Government takes away au from all matches
  - Firms are indifferent between workers
- 3. Internships: new workers are paid an exogenous wage
  - ► Ranking is not allowed
  - Fix  $\tilde{w_0} = z$  and compute the effects of different  $w_0$
- 4. Government subsidizes firms enough to prefer entrants
  - Subsidy  $\sigma_0 = \kappa(1+\rho)$  to every firm that hires a type-0 worker
  - Flat tax  $\tau = \kappa (1 + \rho)e_0/e$

 $Welfare = aggregate \ surplus \ - \ vacancy \ costs$ 

Short- vs Long-run Productivity trade off: less hires of new workers  $\Rightarrow$  more matches without training costs but greater skill loss for entrants

# Baseline economy with ranking

- Welfare level is 0.9398
- Unemployment rate is 5.8%
- Job finding rates
  - $\tilde{f}_0 = 0.42$
  - $f_0 = 0.43$
  - $\tilde{f}_1 = 0.46$
  - $f_1 = 0.69$
- Wages
  - $\tilde{w}_0 = 0.82$
  - $ightharpoonup w_0 = 0.66$  (non-scarred workers accept lower wages to get out of the bad state)
  - $\tilde{w}_1 = 0.92$
  - $w_1 = 0.99$

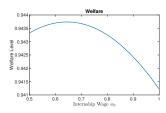
## Intervention 1: Ranking ban

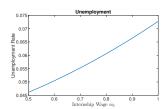
- Welfare level is 0.9433 (from 0.9398); firms rank too much!
- Unemployment rate is 6.9% (from 5.8%)
- Job finding rate is the same for all workers: f = 0.49
  - Increases for all workers other than the experienced ones without scar
- Wages
  - $\tilde{w}_0 = 0.81$
  - $w_0 = 0.84$  (big winners)
  - $\tilde{w_1} = 0.92$
  - $w_0 = 0.99$
- Economics: we "force" firms to incur larger training costs
  - ▶ less entry ⇒ aggregate unemployment increases
  - ▶ more matches with inexperienced workers ⇒ short-run productivity decreases
  - in general equilibrium, however, welfare is higher!
  - ▶ entrants' unemployment duration is shorter ⇒ less likely to suffer skill loss

### Intervention 2: Government subsidies

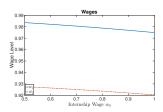
- Welfare level is 0.9427; not as effective as ranking ban
- Unemployment rate is 7.2% (an even greater increase)
- Job finding rate is the same for all workers: f = 0.47
  - Increases for all workers other than the experienced ones without scar
- Wage is the same for all workers: w = 0.96
  - Increases for all workers other than the experienced ones without scar
- Same economics as the government ban
  - ▶ The model that bans ranking delivers higher welfare
  - It avoids the use of additional distortionary taxes

# Intervention 3: Internships





- $\tilde{w_0} = z$
- Welfare always greater than ranking, max at 0.9437 with  $w_0=0.82$
- Too low  $w_0 \Rightarrow$  entrants too cheap, large training and vacancy costs
- Too high  $w_0 \Rightarrow$  back to main channel, large skill losses



### Intervention 4: Type-0 Bias

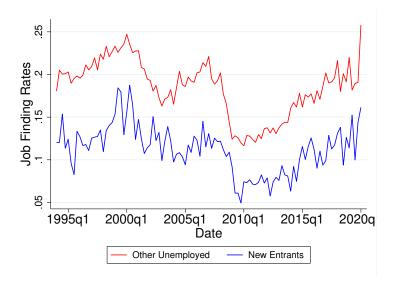
- Welfare level is 0.9531: 1.42% increase, three times more effective than internships!
- Unemployment rate is 6.52% (in between internships and other interventions)
- Raises f<sub>0</sub> almost four times: directly confronts the issue of entrants' long unemployment duration
- Youth Employment Initiative: €8.9 billion program (2014-2020) to directly finance young workers' apprenticeships, traineeships, job placements, and further education within 4 months of leaving school or becoming unemployed
- Based on our results, interventions of this kind are expected to have positive welfare gains even if they raise aggregate unemployment

#### Conclusion

- Built a DMP model with entrants and experienced workers to study the implications of firms' preference for experienced workers
- In the model, firms who hire entrants provide a public service but are not compensated for it
  - Hence, they rank experienced over new workers
- Trade off: more experienced hires have lower training costs and larger match surplus but increase entrants' unemployment duration leading to larger skill losses
- We evaluated four interventions with the calibrated model
  - Ranking ban, government subsidies, internships, type-0 bias
  - ▶ Ranking equilibrium has lower welfare than all government interventions
  - Internships are welfare-enhancing; optimal entrant wages at intermediate levels
  - ► Type-0 bias delivers the largest welfare gains

Thank you!

# Job Finding Rates Workers 16-64



# Job Finding Rates Workers 16-24

