# Job Applications and Labor Market Flows 

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## Motivation

- Since 1980s, search technology has improved, enabling workers to send more applications.


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- Despite $\uparrow$ in applications, trend unemployment outflow rate relatively unchanged.
- But the unemployment inflow rate has exhibited a long run decline




## Question

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- Answer:
- Main benefit of rising applications has not been to $\uparrow$ job-finding rates:
- But to $\uparrow$ the probability of finding a good match, as evidenced by declining separation rates


## Mechanism

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- How (Inflows): applicant pool size affects firm's decision to acquire information
- Higher quality matches formed $\rightarrow$ fewer separations
- But if workers' outside options $\uparrow \rightarrow$ reservation match quality $\uparrow \rightarrow$ more separations
- How (Outflows):
- More worker applications $\rightarrow$ workers contact more vacancies $\rightarrow \uparrow$ job-finding
- But can also $\downarrow$ probability of an offer, and acceptance rate $\rightarrow \downarrow$ job-finding


## Related Literature

- Multiple applications: Albrecht, Gautier and Vroman (2006), Kircher(2009), Galenianos and Kircher(2009), Gautier and Wolthoff(2009), Gautier, Moraga-Gonzalez and Wolthoff (2016), Gautier, Muller, van der Klaauw, Rosholm, and Svarer (2018), Albrecht, Cai, Gautier and Vroman (2020), Wolthoff (2018), Bradley (2020),
- Secular trends in labor market flows: Crump, Eusepi, Giannoni and Sahin (2019), Hyatt and Spletzer (2016), Pries and Rogerson (2019), Molloy, Smith and Wozniak (2020), Mercan (2018), Engbom (2019), Menzio and Martellini (2020)

Contribution: investigate what an increase in worker applications does to labor market flows over time.

The Model

## Model: preliminaries

- Time is discrete
- Unit measure of infinitely-lived risk-neutral workers, discount factor $\beta$
- Workers are:
- Either employed or unemployed
- If unemployed, home production $b$
- If employed, receive wage. Wage is Nash-bargained every period
- Probability $\delta$ employed exogenously become unemployed. Jobs can also be endogenously destroyed
- Only unemployed workers search for jobs


## Model: preliminaries

- A job is a firm-worker pair.
- Output $=$ match quality $x$
- For each application, $x$ : iid draw from $\Pi(x)$ at time of meeting, $\pi(x)$ pdf
- Existing matches observe match quality shock $\rho(x)$ where $\frac{d \rho(x)}{d x}<0$
- Match quality is persistent, new draws from $\Psi(y \mid x)$ where $\frac{d \Psi(y \mid x)}{d x}>0, \psi(y \mid x)$ pdf


## Model: preliminaries

- Search is random
- Vacancies, $v$, cost $\kappa_{V}$ to post
- Unemployed submits $a$ applications $\rightarrow \frac{a}{v}=$ probability apply to particular vacancy.
- Probability firm receives $j$ applications follows Poisson:

$$
q(j)=\frac{1}{j!}\left(\frac{a}{\theta}\right)^{j} \exp \left(-\frac{a}{\theta}\right)
$$

where $\theta=v / u$

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- Matching: firms make offers, workers choose accept/reject
- Bargaining (worker has already accepted an offer and discarded all other offers)
- Production


## Value of operating firm

$$
V^{F}(x)=x-w(x)+\beta(1-\delta)\left([1-\rho(x)] V^{F}(x)+\rho(x) \int_{\widetilde{x}}^{\bar{x}} V^{F}(y) \psi(y \mid x) d y\right)
$$

- current profits: $x-w(x)$
- $1-\rho(x)$ : no match quality shock, get $V^{F}(x)$
- $\rho(x)$ : shock, draw from $\Psi(y \mid x)$


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- Expected value of acquiring information

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V^{I}(j)=\int_{\widetilde{x}}^{\bar{x}} \Gamma(x) V^{F}(x) d[\Pi(x)]^{j}
$$

where $[\Pi(x)]^{j}$ is distribution of maximum order statistic

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- Expected value of acquiring information

$$
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$$

- Firm's information choice problem conditional on $j$ applicants:

$$
\Xi(j)=\max \left\{V^{I}(j)-\kappa_{I}, V^{N I}\right\}
$$

where $\kappa_{I}$ is fixed cost of information

Higher $j$, higher incentive to acquire information

- $V^{I}(j)$ is $\uparrow$ in $j$ as: $[\Pi(x)]^{j} \quad$ FOSD $\quad[\Pi(x)]^{j-1}$

$$
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## Higher $j$, higher incentive to acquire information

- $V^{I}(j)$ is $\uparrow$ in $j$ as: $[\Pi(x)]^{j} \quad$ FOSD $\quad[\Pi(x)]^{j-1}$
- Exists a $j^{*}>1$ such that for all $j \geq j^{*}, V^{I}(j)-\kappa \geq V^{N I}$

- As $j \uparrow$, more likely that at least 1 has high $x$. Info more valuable


## Value of a vacancy

- Under free entry, firms enter until value of a vacancy is zero:

$$
\kappa_{V}=\sum_{j=1}^{\infty} q(j) \Xi(j)
$$

where $q(j)=$ probability of $j$ applicants and $\Xi(j)=\max \left\{V^{I}(j)-\kappa_{I}, V^{N I}\right\}$

## What is $\Gamma(x)$ ?

- If $x \geq \widetilde{x}$, a worker accepts an offer of match quality $x$ if:
- 1) Best match quality drawn
- 2) OR no offers from application with higher match quality $y>x$
- Example with $a=2$

$$
\Gamma(x)=\underbrace{\Pi(x)}_{\text {event } 1}+\underbrace{[1-\Pi(x)][\operatorname{Pr}(\text { no offer } \mid y>x)]}_{\text {event } 2}
$$

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- 1) Best match quality drawn
- 2) OR no offers from application with higher match quality $y>x$
- More generally,

$$
\Gamma(x)=[\Pi(x)]^{a-1}+\sum_{i=1}^{a-1}(a-i)[1-\Pi(x)]^{i}[\Pi(x)]^{a-1-i}[\operatorname{Pr}(\text { no offer } \mid y>x)]^{i}
$$

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$$

- If $x<\widetilde{x}, \Gamma(x)=0$


## Worker's values

- Denote $\phi(x)$ as probability of being hired with match quality $x$

$$
\phi(x)=\Gamma(x) \times \operatorname{Pr}(\text { offer } \mid x)
$$

where

$$
\operatorname{Pr}(\text { offer } \mid x, j)=\mathbb{I}\left(j<j^{*}\right)(1 / j)+\mathbb{I}\left(j \geq j^{*}\right)[\Pi(x)]^{j-1}
$$

and

$$
\operatorname{Pr}(\text { offer } \mid x)=\sum_{j=1}^{\infty} \widehat{q}(j) \operatorname{Pr}(\text { offer } \mid x, j)
$$

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- Probability worker finds a job: $a \int_{\widetilde{x}}^{\bar{x}} \phi(x) \pi(x) d x$
- Value of unemployed

$$
U=b+\beta \underbrace{a \int_{\widetilde{x}}^{\bar{x}} \phi(x) \pi(x) V^{W}(x) d x}_{\text {expected value of finding job }}+\beta \underbrace{\left[1-\int_{\widetilde{x}}^{\bar{x}} a \phi(x) \pi(x) d x\right]}_{\text {fail to find job }} U
$$

- Value of employed with $x$

$$
\begin{aligned}
V^{W}(x)= & w(x)+\beta \overbrace{(1-\delta)(1-\rho(x))}^{\text {no shocks }} V^{W}(x) \\
& +\beta \underbrace{[\delta+(1-\delta) \rho(x) \Psi(\widetilde{x} \mid x)]}_{\text {total separation rate }} U+\beta(1-\delta) \rho(x) \underbrace{\int_{\widetilde{x}} \int^{\bar{x}} V^{W}(y) \psi(y \mid x) d y}_{\text {expected new match value }}
\end{aligned}
$$

## Equilibrium

Equilibrium characterized by

- Information threshold, $j^{*}$
- Reservation match quality, $\widetilde{x}$, determined by indifference condition $S(\widetilde{x})=0$ where $S(x)=V^{F}(x)+V^{W}(x)-U$
- Free entry condition ( $\theta$ )

Quantitative results

## Calibration Strategy

Qn: How does an increase in $a$ affect flows?

- Consider two time periods: 1976-1985, 2010-2019
- Exogenous variable: $a$ increases from 3 to 6 (as per in the data)
- Calibrate model to first time period (1976-1985), model period is a month
- Fixed parameters: $\beta=0.993, \eta=0.5$
- $\Pi(x) \sim \operatorname{Beta}(A, B), \rho(x)=\min \left\{\exp \left(x_{r e f}-x\right), 1\right\}$ where $x_{r e f}=$ mean of $\Pi(x)$
- Joint distribution of shocks $\Psi\left(x^{\prime}, x\right)$ follows Gumbel copula, $\lambda$ is parameter governing how $x^{\prime}$ depends on $x$.
- Parameters to calibrate: $\left\{\kappa_{V}, \kappa_{I}, \delta, \lambda, b, A, B\right\}$.


## Model Fit

| Parameter | Description | Value | Target | Model | Data |
| :---: | :--- | :---: | :--- | :---: | :---: |
| $\kappa_{V}$ | Vacancy posting cost | 0.49 | Outflow rate | 0.43 | 0.41 |
| $\kappa_{I}$ | Cost of information | 0.71 | Recruiting cost/mean wage | 0.97 | 0.93 |
| $\delta$ | Exog. separation rate | 0.025 | Inflow rate | 0.043 | 0.041 |
| $\lambda$ | Persistence of $x$ | 6.99 | $E U_{20} / E U_{80}$ | 4.41 | 4.05 |
| $A$ | Beta distribution | 1.66 | Fraction with no offers | 0.34 | 0.38 |
| $B$ | Beta distribution | 1.17 | Fraction accept given $>1$ offer | 0.82 | 0.84 |
| $b$ | Home production | 0.22 | Reservation wage $/$ mean wage | 0.86 | 0.66 |

## Model eqm going form $a=3$ to $a=6$

- $a \uparrow \Longrightarrow$ workers contact more vacancies $\rightarrow$ more firms want information
$\rightarrow$ vacancy creation $\downarrow$ due to $\uparrow$ in expected recruiting cost as more firms acquire info.

|  | $a=3$ | $a=6$ | Log Diff (\%) |
| :--- | :--- | :--- | :--- |
| Information threshold $j^{*}$ | 5 | 7 | - |
| Percent firms informed | 44.1 | 95.3 | 79 |
| Labor market tightness $\theta$ | 0.69 | 0.50 | 32 |
| Reservation match quality $\widetilde{x}$ | 0.67 | 0.74 | 10 |

Decline in vacancy creation causes $\widetilde{x}$ to observe modest rise

## Model eqm going form $a=3$ to $a=6$

- $\uparrow$ in $a$ explains $1 / 3$ of decline in inflow rate. Outflow rate small $\downarrow$.

$$
\text { outflow rate }=\overbrace{a}^{\text {direct }} \underbrace{\int_{\tilde{x}}^{\bar{x}} \phi(x) \pi(x) d x}_{\text {indirect }}
$$

|  | $a=3$ |  | $a=6$ |  | Log Diff (\%) |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
|  | Model | Data | Model | Data | Model | Data |
| Inflow rate | 0.043 | 0.041 | 0.035 | 0.023 | -20 | -58 |
| Outflow rate | 0.426 | 0.408 | 0.404 | 0.318 | -5 | -25 |
| Outflow rate (2019) |  | 0.408 |  | 0.409 |  | 0 |
| $\quad$ direct $a$ effect | 3 |  | 6 |  | 69 |  |
| $\quad$ indirect $a$ effect | 0.142 |  | 0.067 |  | 74 |  |

## Unemployment inflows

- Larger share of high quality matches, $G(x)_{a=6}$ FOSD $G(x)_{a=3}$

- Greater formation of high quality matches leads to $4.5 \% \downarrow$ in freq. of shock. Conditional on shock, $51 \% \downarrow$ in $P\left(x^{\prime}<\widetilde{x}\right)$.


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- Key takeaway: Although $\widetilde{x} \uparrow$, effect from improved firm selection dominates.


## Testable implications: inflows

|  | $a=3$ |  | $a=6$ |  | Log Diff (\%) |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
|  | Model | Data | Model | Data | Model | Data |
| Share $<1$ quarter | 0.014 | 0.080 | 0.007 | 0.049 | -70 | -49 |
| Share $1<t<3$ years | 0.16 | 0.18 | 0.11 | 0.16 | -36 | -12 |
| Median tenure (years) | 3.28 | 4 | 3.28 | 4 | 0 | 0 |

- Short duration jobs in the data declined the most
- Median tenure unchanged in data


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- Shift from low to high $x$ matches: short duration jobs $\downarrow$, drop in inflow rate driven by change in realized distribution of $x$
$-\widetilde{x} \uparrow \Longrightarrow \Psi(\widetilde{x} \mid x)$ higher: $x$ jobs that continue to exist observe marginally higher separation rate $\rightarrow$ median tenure unchanged:


## Testable implications: outflows

$$
\text { outflow rate }=\overbrace{a}^{\text {direct }} \underbrace{\int_{\tilde{x}}^{\bar{x}} \Gamma(x) \operatorname{Pr}(\text { offer } \mid x) \pi(x) d x}_{\text {indirect }}
$$

|  | $a=3$ |  | $a=6$ |  | Log Diff (\%) |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
|  | Model | Data | Model | Data | Model | Data |
| Fraction with offers | 0.66 | 0.62 | 0.44 | 0.55 | -41 | -12 |
| Acceptance rate | 0.35 | 0.80 | 0.22 | 0.43 | -45 | -62 |
| Res. wage | 0.71 | 5.83 | 0.78 | 6.92 | 8 | 17 |

- More congestion, higher selectivity: Offer probabilities $\downarrow$, res. wage $\uparrow$, acceptance rates $\downarrow\left(\int_{\tilde{x}}^{x} \Gamma(x) \pi(x) d x\right)$,
- If $\widetilde{x}$ held fixed at $a=3$ level: acceptance rates decline by $30 \%$ with $\uparrow$ in $a$

The role of costly information

## The importance of costly information acquisition

- Model nests full information (FI) $\kappa_{I}=0$, and no information (NI) $\kappa_{I} \rightarrow \infty$
- Recalibrate FI and NI model and ask how $a \uparrow$ from 3 to 6 affects flows
- Under FI, firms can always rank workers and extend offer to highest match quality applicant
- Under NI, firm engages in random hiring


## The importance of costly information acquisition

- Constant cost of job creation leads to higher vacancy creation under FI and NI when $a \uparrow$, causing $\theta \uparrow$
- However, FI firms can identify best worker while NI firms can't: benefit of higher $a$ negated for worker in $\mathrm{N}, \uparrow a$ adds to congestion since $\% \Delta \theta<\% \Delta a$
- Hence $\widetilde{x} \downarrow$ in NI, but $\uparrow$ in FI .

|  |  | FI |  | NI |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: | :--- |
|  | $a=3$ | $a=6$ | Log Diff | $a=3$ | $a=6$ | Log Diff |
| $\theta$ | 0.69 | 0.76 | 10 | 0.70 | 0.77 | 9 |
| $\widetilde{x}$ | 0.54 | 0.61 | 13 | 0.55 | 0.53 | -5 |

## The importance of costly information acquisition

- Counterfactual flows under FI and NI

|  | FI |  |  |  |  | NI |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
|  | $a=3$ | $a=6$ | Log Diff | $a=3$ | $a=6$ | Log Diff |
| Inflow rate | 0.046 | 0.043 | -6 | 0.042 | 0.038 | -10 |
| Outflow rate | 0.44 | 0.50 | 12 | 0.45 | 0.34 | -28 |
| $\quad$ direct $a$ effect | 3 | 6 | 69 | 3 | 6 | 69 |
| $\quad$ indirect $a$ effect | 0.15 | 0.08 | -57 | 0.15 | 0.06 | -97 |

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- Under FI, $\operatorname{Pr}($ offer $\mid x, j)=[\Pi(x)]^{j-1} \rightarrow d \operatorname{Pr}($ offer $\mid x, j) / d x \geq 0$. Since $a \uparrow \Longrightarrow$ $\uparrow$ probability of drawing high $x \Longrightarrow$ UE $\uparrow$


## The importance of costly information acquisition

- Counterfactual flows under FI and NI

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- Under NI, $\operatorname{Pr}($ offer $\mid x, j)=\frac{1}{j}$. Since $\% \Delta a>\% \Delta \theta \Longrightarrow q(j)$ shifts rightward $\Longrightarrow$ UE $\downarrow$


## The importance of costly information acquisition

- Counterfactual flows under FI and NI

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| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
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- Higher $\widetilde{x}$ in FI mitigates decline in EU, lower $\widetilde{x}$ in NI contributes to decline in EU.


## Conclusion

- Built model to see how rise in worker applications can affect flows
- Showed how rising $a$ can raise share of informed firms
- Leading to improvement in realized match quality distribution
- Model can explain why outflows don't change but inflows decline
- Key takeaway: increased applications lead to better matches not necessarily higher job-finding rates.

THE END

BACKUP SLIDES

## Shift-Share Analysis

| Fraction of change accounted by | Inflows | Outflows |
| :---: | :---: | :---: |
| Within-group change | 70.7 | 89.8 |
| Between-group: education composition change | 11.1 | 0.5 |
| Between-group: gender composition change | -0.1 | 0.1 |
| Between-group: age composition change | 17.1 | 12.2 |
| Between-group: industry composition change | 1.2 | -2.6 |

Applications across groups and time

|  | EOPP 1979-1980 |  | SCE 2013-2017 |  | Log difference |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Mean | Median | Mean | Median | Mean | Median |
| All | 6.82 | 2.70 | 14.11 | 6.00 | 0.73 | 0.80 |
| College | 4.98 | 2.46 | 11.73 | 6.00 | 0.86 | 0.89 |
| Non-college | 7.36 | 2.82 | 15.11 | 7.00 | 0.72 | 0.91 |
| Male | 7.44 | 2.50 | 12.88 | 6.00 | 0.55 | 0.88 |
| Female | 6.13 | 2.86 | 15.11 | 6.00 | 0.90 | 0.74 |
| Young | 7.24 | 2.86 | 14.39 | 9.00 | 0.69 | 1.15 |
| Old | 4.27 | 1.67 | 13.94 | 6.00 | 1.18 | 1.28 |

## Marginal cost version

Firm's information choice problem: $\max \left\{V^{N I}, \bar{V}^{I}(j)\right\}$ where

$$
\bar{V}^{I}(j)=\max _{n \in\{1 \ldots j\}} V^{I}(n)-k_{I} n
$$




## Marginal cost version

|  | Baseline |  |  | MC |  | Log Diff (\%) |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :---: |
|  | $a=3$ | $a=6$ | $a=3$ | $a=6$ | Baseline | MC |  |
| Inflow rate | 0.043 | 0.035 | 0.041 | 0.037 | -20 | -8 |  |
| Outflow rate | 0.426 | 0.404 | 0.488 | 0.486 | -5 | -0 |  |
| direct $a$ effect | 3 | 6 | 3 | 6 | 69 | 69 |  |
| $\quad$ indirect $a$ effect | 0.142 | 0.193 | 0.162 | 0.081 | -74 | -70 |  |

## Unique equilibrium



## Variable applications

- Applicants search with intensity $\xi$ and draw $a$ applications from Poisson distribution with parameter $\xi$.

$$
p(a)=\frac{1}{a!} \xi^{n} \exp (-\xi)
$$

- A vacancy receives $j$ applications drawn from Poisson distribution with parameter $\xi / \theta$

$$
q(j)=\frac{1}{j!}\left(\frac{\xi}{\theta}\right)^{j} \exp \left(-\frac{\xi}{\theta}\right)
$$

- Firm's problem unchanged, Worker's problem: prior to realizing $a$, all values now take expectation over $a$


## Variable applications

|  | Baseline |  | Variable $a$ |  | Log Diff (\%) |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
|  | $a=3$ | $a=6$ | $a=3$ | $a=6$ | Baseline | Var. $a$ |
| Inflow rate | 0.043 | 0.035 | 0.039 | 0.033 | -20 | -18 |
| Outflow rate | 0.426 | 0.404 | 0.403 | 0.392 | -5 | -3 |
| $\quad$ direct $a$ effect | 3 | 6 | 3 | 6 | 69 | 69 |
| $\quad$ indirect $a$ effect | 0.142 | 0.193 | 0.150 | 0.070 | -74 | -76 |

