

Discussion of

**The price of leverage: Learning from the effect of
LTV constraints on job search and wages**

by Gazi Kabas and Kasper Roszbach

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Overview

- ▶ Consider a policy change in Norway: caps LTV ratio at 85% in 2011
- ▶ Main findings: Reduction in household leverage enables displaced workers to
 - (1) find jobs with higher wages
 - (2) search longer for jobs (i.e., longer unemployment duration)
 - (3) switch to a different occupation or industry

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- ▶ Main findings: Reduction in household leverage enables displaced workers to
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- ▶ My discussions:
 - ▶ Sketch a model to understand the first two findings and competing mechanisms
 - ▶ Extend the model to rationalize the third finding, calling for additional evidence
 - ▶ Comments on research design and estimated effects
 - ▶ Policy implications

Model setup

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 - ▶ Receives UI $\theta > 0$, and wage offers from $F(w)$ on $[\theta, \infty]$.
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 - ▶ Accept or reject, once accepted, will get paid by w forever.
 - ▶ The agent has to repay debt $s < \theta$ in each period.
- ▶ Job search involves risk and liquidity concerns:
 - ▶ Continued search: bearing risk, potentially higher future payoff.
 - ▶ Stop searching: avoid risk, immediately higher current payoff.

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- ▶ The agent follows a cutoff strategy by **choosing the reservation wage w^*** .
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- ▶ w^* is determined by the indifference equation $U = W(w^*)$.

$$u(w^* - s) = u(\theta - s) + \frac{\beta}{1 - \beta} \int_{w^*}^{\infty} [u(w - s) - u(w^* - s)] dF(w).$$

Model prediction and competing channels

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 - ▶ Lower $w^* \Rightarrow$ longer search time (unemployment) and higher expected wage.
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 - ▶ Intuition: $s \downarrow$, less risk averse and liquidity constrained, pickier in job search.
- ▶ With limited liability (no repayment during unemployment), then $\partial w^* / \partial s > 0$
 - ▶ Intuition: debt overhang (Donaldson, Piacentino and Thakor, 2016).
 - ▶ Irrelevant due to full recourse mortgage debt in Norway.

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- ▶ My interpretation/conjecture: the treated group is probably directing their search to a different sector, without changing the broadness of job search.
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 - ▶ Intuition: jobs in high-paid sectors are harder to find. With less debt, displaced workers are less risk averse/liquidity constrained, so search in this sector.
- ▶ **Suggestion:** check if new jobs are in higher-paid industries/occupations.
 - ▶ Decompose increased wage into within vs. across industry/occupation effects.

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 - ▶ Sector- L : wage offers from $F^L(w)$ every period for $t \geq 1$.
 - ▶ Sector- H : wage offers from $F^H(w)$ with prob. $p < 1$ every period for $t \geq 1$.
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 - ▶ $F^H(w)$ stochastically dominates $F^L(w)$.
- ▶ With a proper choice of p , can prove the following:
 - ▶ When $s < \bar{s}$, search in sector- H .
 - ▶ Within either sector- H or - L , higher s reduces w^* .
- ▶ All three empirical findings can be rationalized through a single mechanism.

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 - ▶ If anything, they generate attenuation bias.
- ▶ What are the predictors in the random forest model:
 - ▶ Household deposit, income, wage, credit, and many others.

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- ▶ Tracking same workers over time does not provide clean identification because of wealth accumulation; Mass layoffs do not occur frequently for same workers.

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- (2) Use repeated cross-sections with the same composition of characteristics, focusing on short span between mortgage purchase and job loss
- ▶ Tracking same workers over time does not provide clean identification because of wealth accumulation; Mass layoffs do not occur frequently for same workers.
- ▶ **Suggestion:** try a smaller set of predictors, excluding deposit and credit.

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- ▶ What's the monthly payment of the treated group before/after policy change?
- ▶ What's their average disposable income and credit condition?
- ▶ How the estimated elasticity compared to those estimated in the context of credit/UI benefits on wages/unemployment duration?
 - ▶ e.g., Card et al. (2015), Nekoei_Weber (2017), Herkenhoff et al. (2023)
 - ▶ All these share the same risk/liquidity mechanism

Comment 4: Policy implications

How should we think about the policy implications of these big effects?

- ▶ They don't necessarily support policies that reduce ex-ante leverage.
 - ▶ Housing generates utility and improves welfare.
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 - ▶ Housing generates utility and improves welfare.
 - ▶ Reducing mortgage supply can lower welfare unless there is significant behavioral bias or negative externality on taking debt.
- ▶ The significant adjustments in job search after deleveraging suggests
 - ▶ The failure of credit and insurance markets
 - ▶ Mortgage repayment plans are too rigid.
 - ▶ Borrowers adjust their job search strategies as a way of self-insurance.
- ▶ Responses of observables in labor market provide a way to gauge the credit and insurance market failures (Chetty, 2008).

Conclusion

- ▶ Main comments:
 - ▶ Explore more evidence related to the third finding
 - ▶ Provide some back-of-the-envelope calculations for elasticities
- ▶ Interesting and policy-relevant paper! Best luck with your publication