

# Debt, Human Capital Accumulation, and the Allocation of Talent

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# This paper

- What is the effect of student debt on job choice and human capital accumulation on the job?
- New, convincing, empirical results from clever and clear IV design
  - Higher debt  $\implies$  Higher initial earnings, Lower earnings growth
  - Separate out into between and within occupation effects
- Use empirical results to estimate quantitative model
  1. Schooling decision/occupation choice integrates empirical design
  2. Life-cycle human capital accumulation
- Counterfactual exercises
  - In progress

# Overview

- Two period model
  - Within-occupation - Ben-Porath + Constraints
  - Across-occupation - Roy
- How these relate to the within/between occupation empirics
- Ben-Porath or menu of jobs?
- General discussion

## Within occupation

$$V(\varphi, w, \theta, a_0) = \max_{a', s} u(c_1) + \beta u(c_2)$$

subject to

$$c_1 + a' + w\theta[s] = w\theta + a_0$$

$$c_2 = w\theta \left[ \varphi^{1-\alpha} s^\alpha \right] + Ra' \quad , \quad \varphi > 1$$

$$a' \geq \underline{a}$$

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- Human capital investment

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- Constrained

$$\frac{\beta u'(c_2)}{u'(c_1)} < \frac{1}{R} \rightarrow s^c < s^* \quad , \quad \underbrace{y_1^c > y_1^*}_{w\theta(1-s)} \quad , \quad \Delta y^c < \Delta y^*$$

## Within occupation

$$V(\varphi, w, \theta, a_0) = \max_{a', s} u(c_1) + \beta \mathbb{E} \left[ u(c_2) \right]$$

subject to

$$c_1 + a' + w[s] = w\theta + a_0$$

$$c_2 = w\theta z \left[ \varphi^{1-\alpha} s^\alpha \right] + Ra' \quad , \quad z \sim F(z)$$

$$a' \geq -\underline{a}$$

- Buffer stock - If  $a_0$  low, build savings by increasing labor supply,  $\downarrow s$
- Constraint - Similar discussion as before



## Within occupation

- Discussion of borrowing constraints and human capital development nested in papers that combine Bewley + Ben-Porath
- Huggett, Ventura, Yaron (AER, 2011), Griffy (2020)
- Main result: Initial differences in wealth can have large effects on lifetime human capital accumulation and individual welfare
- As it stands the theory part of the paper focuses a lot on this: Prop 1,2,3
- Suggestion: Shift focus to occupational choice

## Across occupation

- Choose between occupations:  $(\varphi_A, w_A, \theta_A^i)$ ,  $(\varphi_B, w_B, \theta_B^i)$
- $V(\varphi_k, w_k \theta_k^i, a_0^i)$  is increasing in  $(\varphi, w\theta)$
- As the constraint becomes more binding, then  $\downarrow V_\varphi \propto s^\alpha u'(c_2)$ 
  - \* However, for fixed  $(w, \theta)$  a binding constraint doesn't flip  $\succcurlyeq$  over  $k$
- Example:  $\varphi_A < \varphi_B$ 
  - $w_A \theta_A^i < w_B \theta_B^i$ : Both constrained *and* unconstrained prefer  $B$
  - $w_A \theta_A^i > w_B \theta_B^i$ : Constrained may choose  $A$  despite  $\theta_A^i < \theta_B^i$
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Depends a lot on the joint distribution of  $(w_k, \varphi_k)$

# Main empirical results

Dependent Variable: Log(earnings)	(I)	(II)
Effect of student debt (\$000s) on:		
(i) Initial earnings (pvalue)	2.34% 0.01	1.45% 0.02
(ii) Returns to experience (pvalue)	-0.47% 0.07	-0.19% 0.33
<b>Fixed Effects:</b>		
(a) Occupation FE & Occupation x Exp		Yes
(b) Industry FE & Industry x Exp		
(a) and (b)		
Initial wage effect explained		37.75%
RTE explained		60.45%

## 1. Higher debt - Higher initial earnings

- Consistent with Rothstein Rouse (2011), Luo Mongey (2019).
- OLS → Sign flips. Cross-section: higher debt, lower ability → lower wages

## 2. Higher debt - Flatter path for earnings

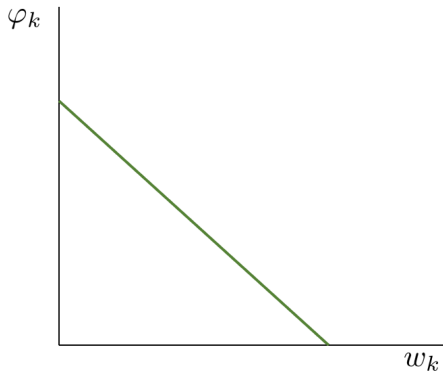
- Consistent with Folch Mazzone (JMP, 2020). Use same IV as LM (2019)
- <https://sites.google.com/view/lucamazzone/>

## Within or across occupation?

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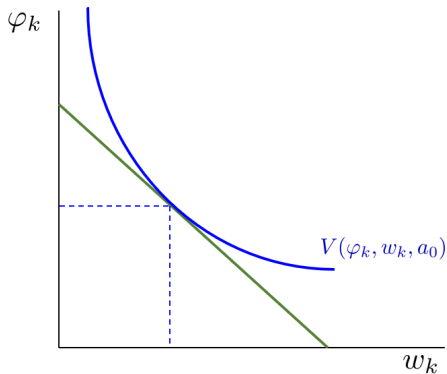
- Within occupation, the returns to experience aren't significantly lower
- Is the Ben-Porath element necessary?
- Seems to be more about the joint distribution of  $(w_k, \varphi_k)$ ?

# Menu of jobs



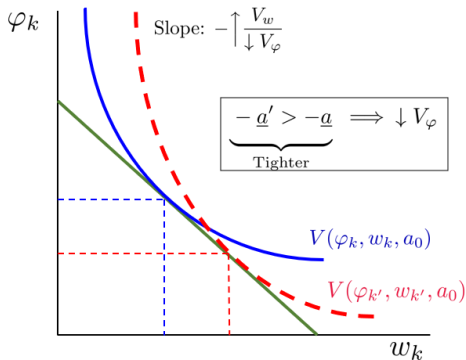
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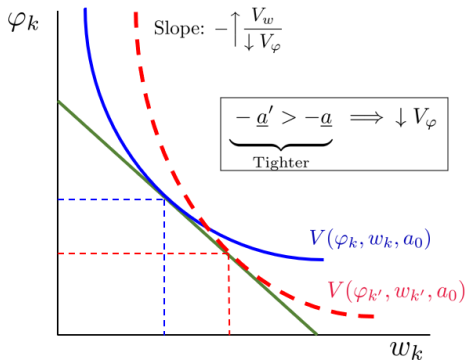
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- Lower assets, on average, puts you at a higher  $w_k$ , lower  $\varphi_k$



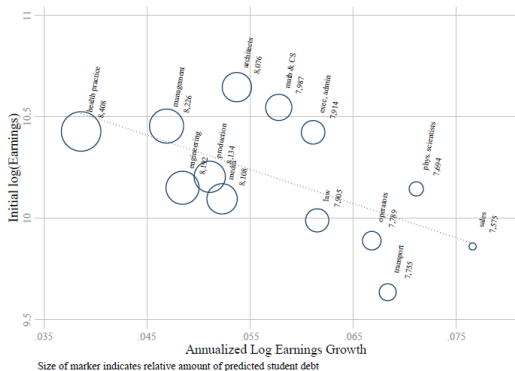
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- Lower assets, on average, puts you at a **higher**  $w_k$ , **lower**  $\varphi_k$
- Luo Mongey (2019): Wages and amenities +ve'ly correlated but search + change in reservation policy due to debt induces -ve'ly correlated in data

# Menu of jobs in the data?

Figure 7: Correlation between initial earnings, yearly earnings growth, and student debt by occupation



- Suggestion 1: Throw out occupations that require a post-graduate degree / don't require a BA to be consistent with empirical evidence
- Suggestion 2: Plot the estimated distribution of  $(w_k, \theta_k)$

# Discussion 1 - Ben-Porath or Menu?

- Do these menus of  $(w_k, \varphi_k)$  exist *within occupations* too?
  - Are they negatively correlated?
- Kitchen cook
  - Line cook: High  $w_k$  , Low  $\varphi_k$
  - Apprentice: Low  $w_k$  , High  $\varphi_k$
- Is Ben-Porath reasonable for explaining within occupation differences in pay?
  1. Choose from a menu of (level, growth)
    - Is there a fundamental difference between this and what the authors have?
    - If not, then maybe this is more straight-forward?
  2. Choose from a menu of (growth, risk) (Kaplan, 2012)
- Hard to think of someone earning more as a first year out lawyer because they are spending *less* time accumulating human capital
- Could be resolved with some direct evidence of the mechanism? Study within occupation lifecycle earnings paths? Examples?

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- Law
  - Corporate: High  $w_k$ , High  $\varphi_k$ , ... High risk, Low amenity
  - Non-profit: Low  $w_k$ , Low  $\varphi_k$ , ... Low risk, High amenity
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## Discussion 2 - Broad appeal

- Shows that student debt provides a useful environment for thinking about the effect of wealth / credit constraints on various economic decisions
- In particular: (i) provides nice instruments, (ii) lots of within cohort variation, (iii) similar point in life, (iv) simple non-defaultable debt contract with no default, (v) can learn a lot from NLSY, other interesting data sets

See many papers by Constantine Yannelis and co-authors!

- E.g. Tighter financial constraints → Higher wages
  - This paper - Higher wages, lower growth
  - Luo Mongey (2019) - Higher wages, Lower amenities
- Both papers identify trade-offs using student debt related IVs / models, but then show how these trade-offs can be of more general relevance for understanding the welfare effects of policies, in particular those that interact with financial constraints
  - E.g. More accommodating financial environments may lower wages, but lead to happier jobs, increase wage growth, better matching

# Conclusion

- Ambitious paper on an important topic
- 'Gold standard' quantitative work
  - (i) Model with IV baked in, (ii) Reduced form IV empirics with convincing IV, (iii) Simulate IV in model to estimate
  - General equilibrium counterfactual exercises
- Needs to clarify contribution a bit more
- Q1: How much is coming from the negative correlation of  $(w_k, \varphi_k)$ ?
- Q2: Can theory of occupation-choice for constrained workers be more clearly explicated part of the paper?