Introduction	Theory	Results	Estimation	Conclusion

Fraternities and Labor Market Outcomes

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Fraternities

- Fraternities are more than "club good":
 - too expensive
 - people mention them on resumes
- Fraternity affiliation has positive effect on expected wage.
- Firms and fraternities realize that.
- Fraternities conduct intensive screening of applicants.

Questions

We want to explain

- How people decide whether to pledge.
- How fraternities select students to admit.
- What are the implications of the outcome of the pledge game for the (expected) wages of students of different abilities.

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Results Preview

- There is an equilibrium where everybody wants to join.
- There is an equilibrium where some people are accepted but do not apply.
 - It is not the highest types who earn the most from signaling.
 - It is lowest types who are admitted who earn the most.
 - Biggest losers are lowest types who are not admitted.
 - This is the empirical equilibrium, and fraternity membership is economically significant.

- New labor market participants are *students*, mass 1.
- Each student can be represented as a pair
 - $(\theta,\mu)\sim h(\cdot)>0.$
 - θ is student's potential productivity after employment.
 - μ is student's socializing value.
 - θ and μ are independent.
- Students like money and socializing.
- The representative fraternity likes students with high μ and students with high expected wage; has limited capacity.
- Firms offer competitive wages:
 - firms observe club membership and a signal about productivity $\tilde{\theta} \sim f_{\tilde{\theta}}(\cdot|\theta)$;
 - wage is equal to expected θ conditional on observables.

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- Students, having beliefs about distribution of other students in a fraternity, decide whether it is profitable to join the fraternity.
- 2 The fraternity picks an admittance rule.
- Some students become fraternity members; values of productivity signals are realized.
- ⁽²⁾ Firms, observing membership of students in fraternity, assign wages to combinations of $\tilde{\theta}$ and membership status.

In a rational expectations equilibrium, everyone's beliefs are consistent with actions of everyone.

Each firm observes a continuum of students with pdf $h(\theta, \mu)$, has a common knowledge of signaling technology $f_{\tilde{\theta}}(\tilde{\theta}|\theta)$, and knows the distribution of students

in (and out of) the fraternity

 $C(\theta,\mu) = I((\theta,\mu)$ is in the club)

Then the wage offered to a frat member with signal $\widetilde{\theta}$ is

$$w_{C}\left(\widetilde{\theta}\right) = \frac{\int \theta h(\theta, \mu) c(\theta, \mu) f_{\widetilde{\theta}}\left(\widetilde{\theta}|\theta\right) d\theta d\mu}{\int h(\theta, \mu) c(\theta, \mu) f_{\widetilde{\theta}}\left(\widetilde{\theta}|\theta\right) d\theta d\mu}$$

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Student's Problem



Students anticipate wages offered by firms, and possess a common knowledge about signaling technology $f_{\tilde{\theta}}(\tilde{\theta}|\theta)$. Student (θ, μ) 's utility outside the fraternity is

$$U_{\bar{C}} = E_{\tilde{\theta}} \left[W_{\bar{C}}(\tilde{\theta}) | \theta \right]$$

Student (θ, μ) 's utility inside the fraternity is

$$U_{C} = E_{\widetilde{\theta}} \left[w_{C}(\widetilde{\theta}) | \theta \right] + n\mu - C$$

Students' solution is:

$$a(\theta,\mu) = I(U_C \ge U_{\bar{C}}|\theta,\mu) \qquad A = ((\theta,\mu)|a(\theta,\mu) = 1)$$

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The Fraternity's Problem

The fraternity observes set *A* and anticipates same wage functions as students do, and picks set *B* of admitted people. Club's utility function is assumed to be

$$\begin{split} W(B) &= W_1 \int_{A \bigcap B} E_{\tilde{\theta}} W_C(\tilde{\theta}|\theta) dH(\theta,\mu) + W_2 \int_{A \bigcap B} \mu dH(\theta,\mu) \\ \text{s.t.} \ \int_{A \bigcap B} h(\theta,\mu) d\mu d\theta \leq \Gamma \end{split}$$

Here Γ is a fraternity's capacity constraint. Intersection of sets of wishing students *A* and admitted students *B* is the set *C* — fraternity members.

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Cutoff Rules



Proposition

There is a cutoff $\mu_A(\theta)$ such that people with μ bigger than that pledge.

Proposition

There is a cutoff $\mu_B(\theta)$ such that people with μ bigger than that are admitted.

Proposition

If signaling technology has a MLRP property, $\mu_B(\theta)$ is decreasing in θ .

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Estimation

Conclusion

Fraternity's Cutoff Rule



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Need Imprefect But Good Signaling

Proposition

If signals $\tilde{\theta}$ are perfectly revealing, fraternity membership in equilibrium does not affect wages.

Proposition

If signals $\tilde{\theta}$ are useless, fraternity membership in equilibrium does not affect wages.

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Assume $(\theta, \mu) \in [0, 1]^2$, and (θ, μ) are uniformly distributed. Also assume that three productivity signals are possible: *H*, *M* and *L*.

$$P(\tilde{\theta} = L|\theta) = 1 - 2\theta, \theta \in [0, \frac{1}{2}] \qquad P(\tilde{\theta} = H|\theta) = 2\theta, \theta \in [\frac{1}{2}, 1]$$

Then two classes of nontrivial equilibria can be observed.

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Conclusion

Application-Unconstrained Equilibrium



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Application-Constrained Equilibrium



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Wages Structure





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Estimation

Single-Peaked Equilibria

Assumption

Either the support for signals $\tilde{\theta}$ is finite, or the support of $f_{\tilde{\theta}}(\tilde{\theta}|\bar{\theta})$ is non-trivial.

Assumption

The cost c of joining the fraternity satisfies $n\underline{\mu} + \overline{\theta} - E[\theta] < c < n\overline{\mu} + \overline{\theta} - E[\theta].$

Proposition

Suppose that Assumptions 1 and 2 hold, and the fraternity is small enough, the equilibrium is single-peaked.

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Estimation

Data - UIUC Fraternities

- 8634 GPAs of seniors in Fall of 2007.
- 701 GPAs of fraternity/sorority members in Fall of 2007.
- Cannot match no other info.

$$P(\Phi|\text{GPA}) = P(\Phi) \frac{f_{\text{GPA}}(\text{GPA}|\Phi)}{f_{\text{GPA}}(\text{GPA})}$$

Consistent estimates of $f(\cdot)$ densities will yield consistent estimate of quantity of members conditional on GPA.

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- Treat quantiles of GPA as "true" ability.
- Take 20 equispaced points of θ and estimates of $P(\Phi|\theta)$.
- Use the three-signal model, fit pseudopoints into 2-kink cutoff line with OLS.
- Add the condition that the cutoff is consistent with the model.

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OLS Estimation





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Estimation

Conclusion

Structural Estimation





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Resul

Estimation



Parameters

Parameter	Estimate	95% confidence
n	0.2771	(0.1193, 0.5312)
С	0.2281	(0.0895, 0.4449)
c/n	0.8234	(0.7141,0.8147)
W_{1}/W_{2}	0.2227	(0.0565, 0.3346)
Г	0.1563	(0.1546, 0.1577)

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Resul

Estimation

Welfare Implications





Comparison to No Fraternity situation

μ

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Estimation

Welfare Implications





Comparison to No Wage Shift situation

μ

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Conclusion

- Frat members earn higher (on average) wage than non-members.
- In not necessarily so when condition on true ability.
- There are two types of equilibria:
 - application-constrained ("single-peaked");
 - application-unconstrained (" $\Phi BK''$).
- Single-peaked equilibrium exists very generally.
- We get single-peaked fraternity in estimates.
- Single-peaked" effect is damaging for highly-able member students...
- … damaging for low-able non-members…
- In beneficial for low-type members.

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