# 14.662, Spring 2015: Problem Set 4

Due Wednesday, May 6 (before class) Heidi L. Williams TA: Peter Hull

## Please answer three out of the four questions

## 1. Taste-Based Discrimination with Wage Posting

In recitation we saw how job search can magnify slight discriminatory preferences among a minority of firms. Here we show this in a model of targeted search over openings with pre-anounced (posted) wages, as considered by Lang et al. (2005).

Suppose all potential workers in a given market are equally productive, generating value v to each of N identical firms. Each firm has one unfilled position and announces a wage to attract a single applicant. A random and unobservable (to both firms and workers) number  $\tilde{Z}$  of workers observe all postings and each apply to only one job. It is common knowledge that  $\tilde{Z}$  is distributed Poisson with mean Z (recall this implies that  $P(\tilde{Z} = k) = Z^k \exp(-Z)/k!$ ). If more than one worker applies, the firm chooses randomly between them.

Denote the posted wage of each firm i by  $w_i$  and the vector of all N wages by W. Workers play mixed strategies in choosing where to apply; write these by  $q(W) = (q_1(W), ..., q_n(W))$  where  $q_i(W)$  is the probability a worker will apply to firm i given announced wages. We assume anonymous strategies, so that for a W where  $w_i = w_j$  we have  $q_i(W) = q_j(W)$ . We further restrict attention to symmetric equilibria in which all workers use the same strategy  $q^*(\cdot)$  taking equilibrium wages as given. In such an equilibrium the number of workers applying to firm i will also be distributed Poisson with mean  $z_i = q_i^*(W)Z$ .

- (a) Write an expression for the probability that a worker will be hired by a firm facing an expected number of applicants z. Use this to write the expected payoff a worker expects from applying to firm i and characterize the firm's expected number of applicants. Show that market clearing then defines a unique symmetric equilibrium of the worker application subgame given W.
- (b) Write an expression for each firm's expected profits given  $w_i$  and  $z_i$ . Use this and your results in (a) to derive the optimal choice of  $z_i$  for a profit-maximizing firm that takes the structure of wages as given. What are equilibrium wages? What are equilibrium expected payoffs to workers and firms?
- (c) Now suppose there are two types of workers, black and white, the total numbers of which are distributed Poisson with means Z and Y respectively. The productivity of white workers remains  $\nu$ , while the value of black workers to firms is  $(1-\delta)\nu$ , where the parameter  $\delta$  (reflecting taste-based discrimination or actual physical differences in production) is small or zero. Assume even when  $\delta = 0$  all firms find black workers to be marginally less desirable, so that they will always choose to hire a white worker when both types apply (but still choosing randomly within racial groups). As before each firm posts a single wage that they commit to paying regardless of race. Characterize the symmetric equilibrium strategy of white workers given wage postings W and knowledge of discriminatory hiring practices.
- (d) Denote the expected number of white and black applicants to a firm i by  $z_i$  and  $y_i$ . What is the probability  $g(y_i, z_i)$  that a black worker will be hired given  $z_i$  and  $y_i$ , and what is his expected income at such a firm? Use this to characterize a symmetric equilibrium strategy of black workers given wage postings and knowledge of discriminatory hiring practices.

- (e) Write an expression for expected firm profits given w<sub>i</sub>, z<sub>i</sub>, and y<sub>i</sub>. Using your expressions for the expected earnings of white and black workers, derive and sign an expression for ∂z<sub>i</sub>/∂w<sub>i</sub> + ∂y<sub>i</sub>/∂w<sub>i</sub>, the marginal change in the expected number of job applicants given an increase in wages. For arbitrarily small δ, argue that in equilibrium some firms will only attract whites ("white firms") while others will only attract blacks ("black firms"). Discuss.
- (f) Let  $N_z$  and  $N_y$  be the numbers of white and black firms with  $r_z \equiv Z/N_z$  and  $r_y \equiv Y/N_y$  denoting the expected number of applicants to each type of firm. Write expressions for equilibrium wages and expected profits of white firms and the expected income of white workers. Argue that equilibrium wages for black firms will be set at the expected income of white workers given arbitrarily small  $\delta$ . Use this to derive expressions for the expected income of black workers and profits of black firms. Describe the discriminatory equilibrium. Are black workers unambiguously worse off than white workers? How does the expected income of white and black workers compare to the model without discrimination?

### 2. Wage Discrimination with Endogenous Human Capital Investment

Many of the models we've seen take groups' human capital investments as given and analyze the implications for wage disparities. Lundberg and Startz (1983) develop a model in which workers anticipate wage setting practices in making their human capital investments. Here you'll analyze the implications of such "endogenous discrimination" for the observed skill/wage distribution.

Let  $\pi_i$  denote the productivity of worker *i*, which depends on innate ability  $a_i$  and acquired skill  $X_i$ .

$$\pi_i = a_i + bX_i$$

Such skill is acquired at cost

$$c(X_i) = \left(\frac{c}{2}\right) X_i^2$$

for c > 0. Both workers and employers know the values of b and c, but employers do not observe true productivity. Instead, they observe test scores that measure productivity with independent error  $\epsilon_i$ .

$$T_i = \pi_i + \varepsilon_i$$

Both workers and employers know  $a_i$  and  $\varepsilon_i$  are normally distributed with means  $\bar{a}$  and  $\bar{\varepsilon}$  and with variances  $\sigma_a^2$ , and  $\sigma_{\varepsilon}^2$ .

- (a) How much training would workers purchase if employers could observe productivity directly? What would be the equilibrium expense on training in this case?
- (b) Solve for the equilibrium wage schedule under imperfect information. Start by assuming the optimal level of training for worker *i* may be written as a linear function of  $a_i$  and  $\varepsilon_i$ :

$$X_i = \rho_0 + \rho_a a_i + \rho_\varepsilon \varepsilon_i$$

- i. Use this expression to derive employers' wage offers  $w_i$  in terms of observed test scores  $T_i$  the mean test score  $\overline{T}$ , and mean productivity  $\overline{\pi}$ .
- ii. Taking this wage schedule as given, solve for the level of training that worker i acquires and interpret your result.
- iii. Use your results from (i) and (ii) to derive a new expression for the wage schedule as a function of individual worker characteristics  $a_i$  and  $\varepsilon_i$ . Interpret your result.
- (c) Now suppose that workers belong to two observable groups. The groups have identical mean innate characteristics  $\bar{a}$  and  $\bar{\varepsilon}$  and test variance  $\sigma_T^2$ , but group 1 has relatively heterogeneous innate ability and relatively homogenous testing ability. Formally,  $\sigma_{a,1}^2 > \sigma_{a,2}^2$  and  $\sigma_{\varepsilon,1}^2 < \sigma_{\varepsilon,2}^2$  for groups 1 and 2. Repeat part (b), this time allowing the wage schedules to differ by group. How much training does a worker in each group receive and what is her wage?
- (d) Compare average wages for the two groups. Is this a discriminatory equilibrium by the Aigner and Cain standard? Why do Lundberg and Startz consider it discriminatory?
- (e) Now suppose that employers are prohibited from offering group-specific wage schedules. Let  $f(\varepsilon_i, T_i)$  denote the joint density of test-specific ability and test scores, and let  $f_1$  and  $f_2$

denote the corresponding group-specific densities. Let  $\alpha$  denote the population fraction of group 1 workers so that

$$f(\varepsilon_i, T_i) = \alpha f_1(\varepsilon_i, T_i) + (1 - \alpha) f_2(\varepsilon_i, T_i)$$

- i. Assume that the equilibrium wage schedule will be linear in  $T_i$ , as in part (b), and let  $\beta$  denote the coefficient on  $T_i$  so that  $w_i = \gamma + \beta T_i$  for some  $\gamma$  and  $\beta$ . Derive the optimal level of human capital investment as a function of  $\beta$ . Use your result to argue that  $f_1$  and  $f_2$  are bivariate normal.
- ii. Derive an expression for  $f(\varepsilon_i \mid T_i)$  and use it to derive the new wage schedule.
- iii. How do average wages for the two groups compare now? Is this equilibrium discriminatory by the Aigner and Cain standard? By Lundberg and Startz's definition?
- (f) Compare the total amount of training obtained under each equilibrium.
  - Perfect information
  - Imperfect information with group-specific wages
  - Imperfect information with a common wage schedule

How does the ban on group-specific wages affect social welfare? Why?

### 3. Intergenerational Mobility

Consider a modified formalization of the Becker and Tomes (1979) model that we covered in class. Family *i* consists of a parent of generation t - 1 that allocates earnings  $y_{i,t-1}$  between consumption  $C_{i,t-1}$  and investment  $I_{i,t-1}$  in the human capital of her child of generation *t*. The investment technology is given by

$$h_{it} = \delta + \theta \ln I_{i,t-1} + e_{it}$$

for  $\theta > 0$  and other sources of human capital (including genetics or cultural inheritance)  $e_{it}$ . As with Becker and Tomes (1979) suppose  $e_{it}$  is first-order autoregressive:

$$e_{it} = \lambda e_{i,t-1} + \nu_{it}$$

for  $\lambda \in (0,1)$  and a white noise error term  $\nu_{it}$ . The child's lifetime income is given by

$$\ln y_{it} = \mu + \rho h_{it}$$

where  $\rho > 0$  denotes the returns to human capital investment.

(a) Suppose parental utility is Cobb-Douglas in consumption and childhood earnings:

$$U_{i,t-1} = C_{i,t-1}^{1-\alpha} y_{it}^{\alpha}$$

Derive the optimal level of human capital investment and interpret.

- (b) Write an expression linking  $\ln y_{it}$  and  $\ln y_{i,t-1}$ . Can a standard intergenerational income regression recover this relationship? Derive an expression (in terms of  $\rho$ ,  $\theta$ , and  $\lambda$ ) for the intergenerational income elasticity coefficient produced under this model. Discuss.
- (c) Suppose we have data on three generations of individuals: t (children), t 1 (parents), and t 2 (grandparents). Write an expression relating  $\ln y_{it}$  to  $\ln y_{i,t-1}$  and  $\ln y_{i,t-2}$ . Becker and Tomes (1979) were the first to note that in a regression of these variables the coefficient on log grandparent income can be negative (though small). A naïve observer of this fact might take this as refutation of a model where parents invest altruistically in their children. What is the correct interpretation of this finding?
- (d) Now suppose endowments are more persistent across generations; that is, suppose  $e_{it}$  evolves as

$$e_{it} = \lambda_1 e_{i,t-1} + \lambda_2 e_{i,t-2} + \nu_{it}$$

for  $0 \le \lambda_2 < \lambda_1 < 1$ . Write an equation linking a child's log income to his parent's, grandparent's, and great-grandparent's. How might the availability of great-grandparent income data update your priors on the parameters?

### 4. Early Life Determinants of Long-Run Outcomes

Deming (2009) is interested (in part) in estimating the effect of Head Start participation on later student test scores. Participation in Head Start, however, is non-random. Altonji, Elder and Taber (2005) provide a framework for thinking about the magnitude of bias induced by selection.

- (a) Using the dataset provided, estimate the effect of Head Start participation on standardized test scores, conditional on year fixed effects and the covariates provided in the dataset. Report your estimate of the effect of Head Start. Discuss some reasons you might expect this estimate to be biased.
- (b) Now we will think about the process of selection into Head Start. Suppose that we can write the following structural equation:

$$Y^* = \alpha HS + W'\Gamma$$
$$= \alpha HS + X'\gamma + \epsilon$$

Here,  $\alpha$  is the true causal effect of Head Start on test scores  $Y^*$ . W is the full set of variables (observed and unobserved) that determine  $Y^*$  along with HS, and  $\Gamma$  is the causal effect of W on  $Y^*$ . X is a vector of the observable components of W, and  $\gamma$  and  $\epsilon$  are *defined* so that  $Cov(X, \epsilon) = 0$ . These same X's may influence whether a student participates in Head Start. Write:

$$HS = X'\beta + \tilde{HS}$$

where  $X'\beta$  is the predicted value of HS from a regression of HS on X and HS is the residual. Show that the coefficient on HS from a regression of  $Y^*$  on HS and X can be expressed as:

$$\tilde{\alpha} = \alpha + \frac{Var(HS)}{Var(\tilde{HS})} (E(\epsilon|HS=1) - E(\epsilon|HS=0))$$

Which parts of this expression are observable? Which are not?

(c) Assume the following variant of Condition 4 in Altonji, Elder and Taber (2005):

$$\frac{E[\epsilon|HS=1] - E[\epsilon|HS=0]}{Var(\epsilon)} = K \frac{E[X'\gamma|HS=1] - E[X'\gamma|HS=0]}{Var(X'\gamma)}$$

Describe intuitively what the term K is. Under the null that Head Start has no impact (i.e.  $\alpha = 0$ ), derive an expression for  $\tilde{\alpha}$  that depends only on K and observables. Assume (without loss) that  $Var(\epsilon) = 1$ .

(d) Use your expression in part (c) to estimate K. How large would selection on unobservables relative to selection on observables have to be in order for the estimated effect of Head Start to come entirely from selection? Be sure to think carefully about how the covariates you include in X affect the sign of your estimates.

### References

- Altonji, Joseph, Todd Elder, and Christopher Taber, "Selection on observed and unobserved variables: Assessing the effectiveness of Catholic schools," *Journal of Political Economy*, 2005, 113 (1), 151–184. 4, 4c
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