## Industrial Organization II (ECO 2901)

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## Problem Set #1. Static Entry Models

Due on Thursday, February 11, 2010

The Stata datafile eco2901\_problemset\_01\_chiledata\_2010.dta contains a panel dataset of 167 local markets in Chile with annual information over the years 1994 to 1999 and for five retail industries: Restaurants ('Restaurantes,' product code 63111); Gas stations ('Gasolineras,' product code 62531); Bookstores ('Librerias,' product code 62547); Shoe Shops ('Calzado,' product code 62411); and Fish shops ('Pescaderias,' product code 62141). The 167 "isolated" local markets in this dataset have been selected following criteria similar to the ones in Bresnahan and Reiss (1991). This is the list of variables in the dataset with a brief description of each variable:

comuna\_code : Coder of local market
comuna\_name : Name of local market

year : Year

procode : Code of product/industry
proname : Name of product/industry

pop : Population of local market (in # people)areakm2 : Area of local market (in square Km)

expc : Annual expenditure per capita in all retail products in the local market

nfirm : Number of firms in local market and industry at current yearnfirm\_1 : Number of firms in local market and industry at previous year

entries : Number of new entrants in local market and industry during current yearexits : Number of exiting firms in local market and industry during current year

Consider the following static entry model in the spirit of Bresnahan and Reiss (JPE, 1991, hereinafter BR-91). The profit of an active firm in market m at year t is:

$$\Pi_{mt} = S_{mt} \ v(n_{mt}) - F_{mt}$$

where  $S_{mt}$  is a measure of market size;  $n_{mt}$  is the number of firms active in the market; v(.) is the variable profit per capita and it is a decreasing function; and  $F_{mt}$  represents fixed operating costs in market m at period t. The function v(.) is nonparametrically specific. The specification of market size is:

$$S_{mt} = POP_{mt} \exp \left\{ \beta_0^S + \beta_1^S \exp c_{mt} + \varepsilon_{mt}^S \right\}$$

where  $POP_{mt}$  is the population in the local market;  $expc_{mt}$  is per capita sales in all retail industries operating in the local market;  $\beta_0^S$  and  $\beta_1^S$  are parameters; and  $\varepsilon_{mt}^S$  is an unobservable component of market size. The specification of the fixed cost is:

$$F_{mt} = \exp\left\{\beta^F + \varepsilon_{mt}^F\right\}$$

where  $\beta^F$  is a parameter, and  $\varepsilon_{mt}^F$  in an unobservable component of the fixed cost. Define the unobservable  $\varepsilon_{mt} \equiv \varepsilon_{mt}^S - \varepsilon_{mt}^F$ . And let  $X_{mt} \equiv (\ln POP_{mt}, expc_{mt})$  be the vector with the observable

characteristics of the local market. We assume that  $\varepsilon_{mt}$  is independent of  $X_{mt}$  and iid over (m,t)  $N(0,\sigma^2)$ .

Question 1. [10 points] Show that the model implies the following probability distribution for the equilibrium number of firms: let  $n_{\text{max}}$  be the maximum value of  $n_{mt}$ , then for any  $n \in \{0, 1, ..., n_{\text{max}}\}$ :

$$\Pr(n_{mt} = n \mid X_{mt}) = \Pr\left(cut(n) \le X_{mt} \begin{bmatrix} \frac{1}{\sigma} \\ \frac{\beta_1^S}{\sigma} \end{bmatrix} + \frac{\varepsilon_{mt}}{\sigma} \le cut(n+1)\right)$$

$$= \Phi\left(cut(n+1) - X_{mt} \begin{bmatrix} \frac{1}{\sigma} \\ \frac{\beta_1^S}{\sigma} \end{bmatrix}\right) - \Phi\left(cut(n) - X_{mt} \begin{bmatrix} \frac{1}{\sigma} \\ \frac{\beta_1^S}{\sigma} \end{bmatrix}\right)$$

where cut(0), cut(1), cut(2), ... are parameters such that for  $n \in \{1, 2, ..., n_{\text{max}}\}$ ,  $cut(n) \equiv (\beta^F - \beta_0^S - \ln v(n))/\sigma$ , and  $cut(0) \equiv -\infty$ , and  $cut(n_{\text{max}} + 1) \equiv -\infty$ .

Question 2. [20 points] Given the Ordered Probit structure of the model, estimate the vector of parameters  $\{1/\sigma, \beta_1^S/\sigma, cut(1), cut(2), ..., cut(n_{\max})\}$  for each of the five industries separately. Given these estimates, obtain estimates of the parameters  $\frac{v(n+1)}{v(n)}$  for  $n \in \{1, 2, ..., n_{\max}\}$ . Present

a figure of the estimated function  $\frac{v(n+1)}{v(n)}$  for each of the five industries. Interpret the results. Based on these results, what can we say about the nature of competition in each of these industries?

Question 3. [20 points] Repeat the same exercise as in Question 3 but using the following specification of the unobservable  $\varepsilon_{mt}$ :

$$\varepsilon_{mt} = \gamma_t + \delta_m + u_{mt}$$

where  $\gamma_t$  are time effects that can be captured by using time-dummies;  $\delta_m$  are fixed market effects that can be captured by using market-dummies; and  $u_{mt}$  is independent of  $X_{mt}$  and iid over (m,t)  $N(0,\sigma^2)$ . Comment the results.

Now, consider the following static entry model of incomplete information. There are  $N_{mt}$  potential entrants in market m at period t. The profit of an active firm in market m at year t is:

$$\Pi_{imt} = S_{mt} \ v(n_{mt}) - F_{imt}$$

Market size,  $S_{mt}$ , has the same specification as in Question 2. The firm-specific fixed cost,  $F_{mt}$ , has the following specification:

$$F_{imt} = \exp\left\{\beta^F + \varepsilon_{mt}^F + \xi_{imt}\right\}$$

The random variables  $\varepsilon_{mt}^S$ ,  $\varepsilon_{mt}^F$ , and  $\xi_{imt}$  are unobservable to the researcher. From the point of view of the firms in the market, the variables  $\varepsilon_{mt}^S$  and  $\varepsilon_{mt}^F$  are common knowledge, while  $\xi_{imt}$  is private information of firm i. We assume that  $\xi_{imt}$  is independent of  $X_{mt}$  and iid over (m,t)  $N(0,\sigma_{\varepsilon}^2)$ .

The number of potential entrants,  $N_{mt}$ , is assumed to be proportional to population:  $N_{mt} = \lambda$   $POP_{mt}$ , where the parameter  $\lambda$  is industry specific.

Question 4. [5 points] Consider the following estimator of the number of potential entrants:

$$\hat{N}_{mt} = \operatorname{integer} \left\{ \max_{\text{over all}\{m',t'\}} \left[ \frac{entrants_{m't'} + incumbents_{m't'}}{POP_{m't'}} \right] \ POP_{mt} \right\}$$

where  $entrants_{m't'}$  and  $incumbents_{m't'}$  are the number of new entrants and the number of incumbents, respectively, in market m' at period t'. Show that  $\hat{N}_{mt}$  is a consistent estimator of  $N_{mt} = \lambda POP_{mt}$ .

Question 5. [15 points] Let  $P(X_{mt}, \varepsilon_{mt})$  be the equilibrium probability of entry given the common knowledge variables  $(X_{mt}, \varepsilon_{mt})$ . And let  $G(n|X_{mt}, \varepsilon_{mt})$  be the distribution of the number of active firms in equilibrium conditional on  $(X_{mt}, \varepsilon_{mt})$  and given that one of the firms is active with probability one. (i) Obtain the expression of the probability distribution  $G(n|X_{mt}, \varepsilon_{mt})$  in terms of the probability of entry  $P(X_{mt}, \varepsilon_{mt})$ . (ii) Derive the expression for the expected profit of an active firm in terms of the probability of entry. (iii) Obtain the expression of the equilibrium mapping that defines implicitly the equilibrium probability of entry  $P(X_{mt}, \varepsilon_{mt})$ .

**NOTE:** For Questions 6 and 7, consider the following approximation to the function  $\ln E(v(n_{mt}) \mid X_{mt}, \varepsilon_{mt}, 1 \text{ sure})$ :

$$\ln E(v(n_{mt})|X_{mt}, \varepsilon_{mt}, 1 \text{sure}) \simeq \ln v(1) + \sum_{n=1}^{N_{mt}} G(n|X_{mt}, \varepsilon_{mt}) \left[ \frac{v(n) - v(1)}{v(1)} \right]$$

This is a first order Taylor approximation to  $\ln E(v(n_{mt})|X_{mt}, \varepsilon_{mt}, 1sure)$  around the values v(1) = v(2) = ... = v(N), i.e., no competition effects. The main advantage of using this approximation for estimation is that it is linear in the parameters  $\left[\frac{v(n)-v(1)}{v(1)}\right]$ .

Question 6. [20 points] Suppose that  $\varepsilon_{mt} \equiv \varepsilon_{mt}^S - \varepsilon_{mt}^F$  is just an aggregate time effect,  $\varepsilon_{mt} = \gamma_t$ . Use a two-step pseudo maximum likelihood method to estimate the vector of parameters:

$$\theta \equiv \left\{ \frac{1}{\sigma_{\xi}}, \ \frac{\beta_1^S}{\sigma_{\xi}}, \ \frac{\ln v(1) + \beta_0^S - \beta^F}{\sigma_{\xi}}, \ \frac{v(n) - v(1)}{\sigma_{\xi} \ v(1)} : n = 2, 3, \dots \right\}$$

for each of the five industries separately. Given these estimates, obtain estimates of the parameters  $\frac{v(n+1)}{v(n)}$  for  $n \in \{1, 2, ..., n_{\text{max}}\}$ . Present a figure of the estimated function  $\frac{v(n+1)}{v(n)}$  for each of the five industries. Interpret the results. Based on these results, what can we say about the nature of competition in each of these industries? Compare these results to those from the estimation of the BR-91 models in Questions 2 and 3.

Question 7. [10 points] Repeat the same exercise as in Question 7 but using the following specification of the unobservable  $\varepsilon_{mt}$ :

$$\varepsilon_{mt} = \gamma_t + \delta_m$$

where  $\gamma_t$  are time effects that can be captured by using time-dummies; and  $\delta_m$  are fixed market effects that can be captured by using market-dummies. Comment the results. Compare these results to those in Questions 2, 3, and 6.