Economics 350: Two Interpretations of the Mincer Equation Learning-by-doing vs. On-the-job Training

Based in part on James Heckman, Lance Lochner, and Ricardo Cossa's "Learning-by-doing vs. on-the-job training: Using variation induced by the EITC to distinguish between models of skill formation," in Phelps, Edmund S. *Designing inclusion: tools to raise low-end pay and employment in private enterprise.* Cambridge Univ Press, 2003, pp. 74–130.

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- Is learning rivalrous with or complementary with working? Rivalrous with or complementary with earning?
- ② Do people pay for their learning? What is the form of the payment? Foregone earnings? Foregone leisure? Both?
- What is the correct price of time to include in a labor supply equation? Is the measured average wage the correct price of time?
- What is the correct interpretation of empirical Mincer earnings equations? What do we learn from cross-section estimates?



Point of Departure:

• Two observationally equivalent interpretations of

$$\ln W = \alpha_0 + \alpha_1 S + \alpha_2 x + \alpha_3 x^2$$

- *S* = schooling
- *x* = work experience
- α₁ = "average rate of return" to schooling
- *α*₂, *α*₃ = "returns to experience"



Mincer's Justification

- OJT model appeals to Becker-Ben Porath model of experience *x*.
- Learning comes at the expense of earning.
- k(x) earnings forgone as % of potential earnings.
- Assume:
 - **1** Constant rates of return (or if heterogeneous assume independent of level of investment: r_p).
 - 2 $k(x) = 1 \frac{x}{T}$ where T is the maximum possible amount of experience.
 - 3 Effect of OJT (in logs) additively separable from schooling.
 - T functionally independent of S. (Each year of schooling adds one year to effective working life.)
 - **5** r(x) same for all x.

• Then (1), (2), (3), (4) and (5) \Rightarrow Mincer model. (See Mincer handout.)

- α₁ = r_s; average "rate of return to schooling."
- $\alpha_2, \alpha_3 \Rightarrow r_p$; average rate of return to post school investment.
- Can show:

$$\left(\alpha_2 = \left(r_p + \frac{r_p}{2T}\right); \alpha_3 = -\frac{r_p}{2T}\right)$$

(see "Mincer" notes).



Second Model

- Empirically indistinguishable from first model.
- *x* =cumulated work experience.
- The only cost of *x* is forgone leisure.
- Work produces current and future wage growth.
- In $W = \alpha_1 + \alpha_2 S + \alpha_3 x + \alpha_4 x^2$.
- Keane and Wolpin (1997, 2001) and many successor models.
- Keane, 2016, *EJ*, on reading list.
- Question: can we distinguish the two models?



General model and special cases: 2 period analysis: Worker Problem

(C₀, L₀): Consumption and leisure in "0"
(C₁, L₁): Consumption and leisure in "1"

Preferences:
$$U(C_0, L_0) + \frac{1}{1+\rho}U(C_1, L_1)$$
 (1)

• *r* is the borrowing rate – perfect certainty.



- H_0 = initial human capital; H_1 = final human capital
- Production function of human capital ("technology of skill formation"):
 H₁ = H₀ + F(θ₀, H₀, 1 − L₀) F_{θ₀} ≥ 0, F_{H₀} ≥ 0, F_{1-L₀} ≥ 0.
- Can add depreciation (assume no depreciation for simplicity).
- $\theta_0 =$ "quality" (investment content) of job in period 0.
- As $heta_0 \uparrow H_1 \uparrow (F_{ heta_0} > 0)$
- $\theta_1 \equiv 0$; no investment in second period because no tomorrow.
- Assume $\rho = r = 0$.
- θ₀ is valuable.
- It helps produce human capital.
- However, you have to be at a firm to realize the investment opportunity.
- Does it have a price?



- Earnings in "0": $W(H_0, 1 L_0, \theta_0)$
- Earnings in "1": $W(H_1, 1 L_1, \theta_1)$
- Budget Constraint:

$$C_0 + C_1 = \underbrace{\mathcal{W}(H_0, 1 - L_0, \theta_0)}_{\text{Earnings in period } 0} + \underbrace{\mathcal{W}(H_1, 1 - L_1)}_{\text{Earnings in period } 1}$$
(2)



Pricing of human capital services in final output:

• *R*: rental rate on units of human capital (efficiency units model).

•
$$W(H_0, 1 - L_0, \theta_0) = \underbrace{RH_0(1 - L_0)}_{\text{potential earnings}} - \underbrace{P(\theta_0, 1 - L_0, H_0)}_{\text{amount paid by agent to acquire human capital i.e., to access } \theta_0$$

- $W(H_1, 1 L_1) = RH_1(1 L_1)$
- P(θ₀, 1 − L₀, H₀) is the cost of quality θ₀ with 1 − L₀ hours of work and with the agent having H₀ amount of human capital with training content θ₀.



Becker-Ben Porath Model

- Leisure fixed: $L_0 = L_1 = \overline{L}$
- Jobs priced out in a special way
- Price of learning content θ in a job: $P(\theta_0, 1 L_0, H_0) = P(\theta_0)$
- Production function: $H_1 = F(\theta_0, H_0) + H_0$
- $\theta_0 = I$ (time spent investing)
- $P(\theta_0) = RH_0 I$ (cost of investment)
- $W(H_0, 1 L_0, \theta_0) = RH_0(1 \bar{L}) RH_0I$
- Can add leisure (Blinder and Weiss, 1976; Heckman, 1976)
- The Ben-Porath (1967) model has a special functional form

$$H_1 = G(H_0\theta_0) + H_0 \tag{3}$$

- "Neutrality" (MC of investment = MR of investment)
- Question: What are the first order conditions for the model (1), (2), and (3) with leisure fixed $L_0 = L_1 = \overline{L}$?
- How does investment depend on H₀ and R?

Learning by Doing (LBD) Model in the Literature

- Cost of learning is foregone leisure.
- Ignored in Becker-Ben Porath models.
- Investment is a "free good."



$$\frac{\partial P}{\partial (1 - L_0)} = \frac{\partial P}{\partial \theta_0} = 0$$
$$\frac{\partial F}{\partial (1 - L_0)} > 0 \qquad ; \qquad \frac{\partial F}{\partial \theta_0} = 0$$

(Imai and Keane, 2004; Keane, 2016)

- Implicitly θ_0 : the same at all jobs.
- Usually kept implicit.
- Free lunch. (No direct cost of learning.)
- The only cost of learning is *foregone leisure*.
- Many intermediate cases are possible.



Firm Side of the Problem

- Firm has a valuable good: training possibilities.
- Firms heterogeneous in training opportunities.
- Two sector model of the firm.
- Firms: can produce skills and use skills for producing final output, offer training opportunities, or both.
- Profits for a one-worker firm offering opportunity θ_0 :

$$\prod_{\text{Profits}} = \underbrace{J((1-L_0), H_0, \theta_0)}_{\text{Output}} + \underbrace{P(\theta_0, (1-L_0), H_0)}_{\substack{\text{Revenue from selling} \\ \text{training opportunities} \\ \text{to workers}} - \underbrace{WRH_0(1-L_0)}_{\text{Labor Costs}}$$



• *Hedonic equilibrium* for firms and workers in skill production sector:

 $P(\theta_0, (1 - L_0), H_0, R)$ is market clearing pricing function.

- (Will establish properties later.)
- Equates demand and supply across jobs, indexed by θ , L_0 .
- Question: What is the life cycle mobility of workers across firms?



Can One Distinguish Between the Two Models?

• See Cossa, Heckman et al. (2003).



Consider taxes and subsidies in periods "0" and "1". Model 1: OJT (Becker-Ben Porath with Leisure)

 Motivated by analysis of EITC (Earned Income Tax Credit) program (Cossa et al., 2003).



- Assume learning takes place on the job.
- τ_0 , τ_1 are proportional subsidies: $\tau_0 > 0$, $\tau_1 > 0$.
- R = 1
- Individuals maximize (1): $U(C_0, L_0) + U(C_1, L_1)$ subject to

$$C_0 + C_1 = \underbrace{(1 + \tau_0)H_0(1 - I_0 - L_0)}_{(1 + \tau_1)H_1(1 - L_1)} + \underbrace{(1 + \tau_1)H_1(1 - L_1)}_{(1 + \tau_1)H_1(1 - L_1)}$$

Measured after tax/subsidy earnings in period 0

Measured after tax/subsidy earnings in period 1UNIVERSITY OF CHICAGO

- Assume $H_1 = F(I_0) + H_0$ (abstract from self productivity).
- FOC for I_0 : $(1 + \tau_0)H_0 \le (1 + \tau_1)(1 L_1)F'(I_0)$
- Question: What is the FOC for the Ben Porath version of the model with labor supply?
- $H_1 = F(I_0H_0) + H_0$
- $(1 + \tau_0)H_0 \le (1 + \tau_1)(1 L_1)G'(IH_0)H_0$
- Neutrality: *H*₀ raises productivity proportional to opportunity cost.



Consider the General Model

Compensate for income effects (λ constant or Frisch demands),

- $\tau_0 > \tau_1 = 0$: Period 0 subsidy raises MC of I_0 : $H_1 \downarrow$
- $\tau_1 > \tau_0 = 0$: Period 1 subsidy raises MR of I_0 : $H_1 \uparrow$
- τ₀ = τ₁ > 0: Flat subsidy increases h₁ = 1 − L₁ (time spent in market working) and raises MR of I₀: (I₀, H₁)↑ (remember that wealth effects are neutralized).



Digression:



Heckman Lochner Cossa

Learning-by-doing

• Why? Consider the following Lagrangian:

$$\mathcal{L} = U(C_0, L_0) + U(C_1, L_1) - \lambda [C_0 + C_1 - (1 + \tau_0)H_0(1 - I_0 - L_0) - (1 + \tau_1)H_1(1 - L_1)]$$

• FOC: *C*₀, *C*₁

 $U_1(C_0, L_0) = \lambda$ $U_1(C_1, L_1) = \lambda$



• FOC: *L*₀, *L*₁

$$U_2(C_0, L_0) = \lambda(1 + \tau_0)H_0$$
$$U_2(C_1, L_1) = \lambda(1 + \tau_1)H_1$$

- FOC: *I*₀
- Assume $H_1 = F(I_0) + H_0$

$$(1 + \tau_0)H_0 = (1 + \tau_1)F'(I_0)(1 - L_1)$$



λ is Held Constant

• Suppose initially that we have separability

$$U(C_0, L_0) = \phi(C_0) + \eta(L_0)$$
$$U(C_1, L_1) = \phi(C_1) + \eta(L_1)$$

- Then if $au_0 = au_1 \uparrow$, $L_0, L_1 \downarrow \therefore I_0 \uparrow$, $H_1 \uparrow$
- In the general case where τ₀ = τ₁ = τ, as τ ↑, price of leisure increases and agents substitute toward consumption

•
$$(1 - L_1) \uparrow \Rightarrow I_0 \uparrow \Rightarrow H_1 \uparrow$$



- If we add back wealth and income effects discourage work and reduce investment in all cases.
- Question: For a Ben Porath Technology with labor supply, what is the answer to these questions for these subsidy changes?



Model 2: Learning By Doing (LBD): Cost of Learning is Same as Cost of Work–Foregone Leisure

- R = 1
- Individuals maximize $U(C_0, L_0) + U(C_1, L_1)$ subject to

$$C_0 + C_1 = (1 + \tau_0)H_0(1 - L_0) + (1 + \tau_1)H_1(1 - L_1).$$

and

$$H_1 = H_0 + \phi(1 - L_0)$$
 (Period "1" earnings)

FOC:

$$U_{2}(C_{0}, L_{0}) = \lambda[\underbrace{H_{0}(1 + \tau_{0})}_{W_{0}(1 + \tau_{0})} + \overbrace{\phi'(1 - L_{0})(1 - L_{1})(1 + \tau_{1})}^{\text{Effect of current hour of work}}_{W_{0}(1 - L_{0})(1 - L_{1})(1 + \tau_{1})}]$$

$$\lambda[\underbrace{H_{0} + \phi(1 - L_{0})(1 + \tau_{1})}_{W_{0}(1 + \tau_{0})} + \overbrace{\phi'(1 - L_{0})(1 + \tau_{1})}^{W_{0}(1 + \tau_{1})}]_{W_{0}(1 + \tau_{0})}]$$

Compensate for income effects (λ constant)

- $\tau_0 = \tau_1 > 0$: Flat subsidy increases the current and future return to work $h_0 = 1 L_0$ and $h_1 = 1 L_1$.
- \therefore $H_1 \uparrow$.
- $au_0 > au_1 = 0$: Period 0 subsidy raises current return to h_0 , $(H_1)\uparrow$
- $au_1 > au_0 = 0$: Period 1 subsidy raises future return to h_1 , $(H_1)\uparrow$
- Wealth and income effects discourage work and reduce learning and investment in all cases.



Model 2': LBD with a Market for Learning Opportunities (No Free Lunch and Heterogeneous Firms)

- Suppose firms may offer different learning opportunities indexed by θ ∈ (θ₀, θ₀).
- So $H_1 = H_0 + \phi(1 L_0, \theta_0)$ where $\frac{\partial^2 \phi}{\partial (1 L_0) \partial \theta_0} > 0$.
- With a distribution of firm types, a market for learning will emerge.
- All old workers and young workers who expect high L_1 (low h_1) place little value on learning, θ_0 .
- Pricing function P(θ₀) may arise with P'(θ₀) > 0. (Worker pays for learning opportunities)
- This adds a new wrinkle to the LBD model.
- Wage earnings:
 - In the first period: $W(H_0, \theta_0) = H_0(1 L_0) P(\theta_0)$.
 - In the second period, it is $H_1(1-L_1)$

- We acquire a new first order condition in the LBD model.
- Individuals choose firm type or learning opportunity (θ) according to:

$$(1+\tau_0)P'(\theta) = (1+\tau_1)(1-L_1)\frac{\partial\phi(1-L_0,\theta_0)}{\partial\theta_0} \qquad (*)$$



- Consider taxes and subsidies in this model.
- As before, consider an income-compensated change from an initial position: τ₀ = τ₁ = 0.
- $\tau_0 = \tau_1 > 0$: Flat subsidy increases current and future return to h_0 (= period zero hours of work) and raises return to θ_0 by increasing h_0 and h_1 (period 1 hours of work).
- \therefore This is a force for $H_1 \uparrow$.
- But it raises the cost of buying θ_0 , a force for $H_1 \downarrow$ (see *).



- $\tau_0 > \tau_1 = 0$: Period 0 subsidy raises current return to h_0 and the MC of θ_0 .
- **Ambiguous on** *H*₁ (everything else constant).
- $\tau_1 > \tau_0 = 0$: Period 1 subsidy raises future return to h_0 and return to θ_0 .
- \therefore $H_1 \uparrow$.
- Test of model not clear anymore.
- Note: Can equate this model with OJT model if θ_0 equated to I_0 in Ben Porath. Then the two models are indistinguishable.
- Implicit is a theory of life cycle mobility (stepping stone mobility).



Implications for Measured Wages

OJT:

- First period earnings < potential earnings if investment is paid by foregone earnings (wage rates understated).
- First period earnings = potential earnings if investment off the job or not paid via earnings.

LBD (free lunch):

• First period earnings < potential earnings. Wage rates understated (price of time is greater).

