

# Taxation under Learning by Doing

Miltos Makris

Alessandro Pavan

March 2, 2018

# Learning by Doing

- **Learning-by-doing (LBD) :**
  - positive effect of time spent at work on productivity
  - human capital investment side-product of labor supply
- LBD: significant source of productivity growth
  - Dustmann and Meghir (2005)
    - in first 2 years of employment, wages grow, on average, by 8.5% in 1th year and 7.5% in 2nd
  - Blundell and MaCurdy (1999) and Farber (1999)
    - overviews of effects of work experience on wage dynamics

# This Paper

- Effects of LBD on optimal tax codes
- Dynamic Mirrleesian economy in which agents' productivity
  - their own private information
  - stochastic
  - evolves endogenously over lifecycle (due to LBD)
- Novel effects contributing to higher labor wedges
- Quantitatively significant impact on optimal codes
  - level
  - progressivity
  - dynamics
- Dynamic mechanism design with endogenous types

## Related literature

- **Optimal taxation:** Mirrlees (1971), Diamond (1998), Saez (2001)...
  - static
  - exogenous productivity
- **New Dynamic Public Finance:** Albanesi and Sleet (2006), Kocherlakota (2010), Gorry and Oberfield (2012), Kapicka (2013), Farhi and Werning (2013), and Golosov et al. (2016)...
  - dynamic
  - exogenous productivity
- **Taxation w. Human Capital Accumulation:** Krause (2009), Best and Kleven (2013), Kapicka (2006, 2015a,b), Kapicka and Neira (2016), and Stantcheva (2016)
  - LBD: side-product of labor supply (cannot be controlled separately)
  - stochastic effect on future productivity
  - time-evolving private information

# Road Map

- Simple textbook environment
- Risk aversion
- Utilitarian objective
- Quantitative analysis
- Conclusions

# Simple Environment

- $T=2$  (case  $T = \infty$ : “Incentives for Endogenous Types”)
- $\theta_t$ : productivity
  - privately observed by worker at beginning of period  $t$
- $F_1$ : cdf of initial distribution (density  $f_1$ )
- $F_2(\cdot|\theta_1, y_1)$ : cdf of  $\theta_2$ 
  - dependence on  $y_1$ : LBD

- Example:

$$\theta_2 = Z_2(\theta_1, y_1, \varepsilon_2) = \theta_1^\rho y_1^\zeta \varepsilon_2$$

$\zeta$ : intensity of LBD

- Impulse Response

$$I_1^2(\theta, y_1) = \left. \frac{\partial Z_2(\theta_1, y_1, \varepsilon_2)}{\partial \theta_1} \right|_{\varepsilon_2: Z_2(\theta_1, y_1, \varepsilon_2) = \theta_2} = \rho \frac{\theta_2}{\theta_1}$$

where  $\theta \equiv (\theta_1, \theta_2)$

# Simple Environment

- Worker's payoff:

$$U^A = \sum_t \delta^{t-1} (c_t - \psi(y_t, \theta_t))$$

- $\psi(y_t, \theta_t) = \frac{1}{1+\phi} \left( \frac{y_t}{\theta_t} \right)^{1+\phi}$
- Allocation rule  $\chi(\theta) = (y_t(\theta^t), c_t(\theta^t))_{t=1,2}$
- Worker expected life-time utility

$$V_1(\theta_1) = \mathbb{E}^{\lambda[\chi]|\theta_1} \left[ \sum_t \delta^{t-1} \left( c_t(\tilde{\theta}^t) - \psi(y_t(\tilde{\theta}^t), \tilde{\theta}_t) \right) \right]$$

where  $\lambda[\chi]$  is endogenous distribution over  $\Theta = \Theta_1 \times \Theta_2$  under  $\chi$

## Principal's (dual) problem:

- Principal's Rawlsian problem
- Maximizing expected tax revenues

$$R = \mathbb{E}^{\lambda[\lambda]} \left[ \sum_t \delta^{t-1} \left( y_t(\tilde{\theta}^t) - c_t(\tilde{\theta}^t) \right) \right]$$

subject to Rawlsian constraint

$$\min_{\theta_1} V_1(\theta_1) \geq \kappa$$



## First Best: period-2 output

- For any  $\theta = (\theta_1, \theta_2)$ :

$$\max_{y_2} [y_2 - \psi(y_2, \theta_2)]$$

- FOC:

$$\psi_y(y_2^*(\theta), \theta_2) = 1,$$

⇒ output driven by marginal production cost

## First Best: period-1 output

- For any  $\theta_1$ :

$$\max_{y_1} \left\{ y_1 - \psi(y_1, \theta_1) + \delta \mathbb{E}^{\lambda[x]|\theta_1, y_1(\theta_1)} \left[ y_2(\tilde{\theta}) - \psi(y_2(\tilde{\theta}), \tilde{\theta}_2) \right] \right\}$$

- FOC:

$$1 + LD_1^x(\theta_1) = \psi_y(y_1(\theta_1), \theta_1)$$

where

$$LD_1^x(\theta_1) \equiv \delta \frac{\partial}{\partial y_1} \mathbb{E}^{\lambda[x]|\theta_1, y_1(\theta_1)} \left[ y_2(\tilde{\theta}) - \psi(y_2(\tilde{\theta}), \tilde{\theta}_2) \right]$$

⇒ output driven **also** by LBD impact on future expected surplus via its effect on future conditional distribution

⇒ **Higher output under LBD** for any given  $\theta_1$  (due to FOSD and increasing period-2 surplus)

## Second Best: Incentive Compatibility

- Continuation utility (history  $\theta = (\theta_1, \theta_2)$ ):

$$V_2(\theta) \equiv c_2(\theta) - \psi(y_2(\theta), \theta_2)$$

- IC-2: for any  $\theta_1$ ,  $V_2(\theta_1, \cdot)$  Lipschitz continuous and s.t. (Mirrlees)

$$V_2(\theta_1, \theta_2) = V_2(\theta_1, \underline{\theta}_2) - \int_{\underline{\theta}_2}^{\theta_2} \psi_{\theta}(y_2(\theta_1, s), s) ds$$

- IC-1:  $V_1(\cdot)$  Lipschitz continuous and s.t. (Pavan, Segal, Toikka)

$$V_1(\theta_1) = V_1(\underline{\theta}_1)$$

$$- \int_{\underline{\theta}_1}^{\theta_1} \left\{ \psi_{\theta}(y_1(s), s) ds + \delta \mathbb{E}^{\lambda} [ \chi ]^s \left[ I_1^2(\tilde{\theta}, y_1(s)) \psi_{\theta}(y_2(\tilde{\theta}), \tilde{\theta}_2) \right] \right\} ds$$

- In addition, IC also requires  $y_1(\cdot)$  and  $y_2(\cdot)$  satisfy integrability constraints (ignored and checked ex post)

## Second Best: Handicaps

- Expected tax revenues equal:

$$R = \mathbb{E}^{\lambda[\chi]} \left[ \sum_t \delta^{t-1} \left( y_t(\tilde{\theta}^t) - \psi(y_t(\tilde{\theta}^t), \tilde{\theta}_t) - h_t(\tilde{\theta}^t, y^t(\tilde{\theta}^t)) \right) \right] - V_1(\underline{\theta}_1),$$

- first-period "handicap":

$$h_1(\theta_1, y_1) \equiv -\frac{1}{\gamma_1(\theta_1)} \psi_{\theta}(y_1, \theta_1) \quad \text{where } \gamma_1(\theta_1) \equiv \frac{f_1(\theta_1)}{1 - F_1(\theta_1)}$$

- second-period "handicap":

$$h_2(\theta, y) \equiv -\frac{I_1^2(\theta, y_1)}{\gamma_1(\theta_1)} \psi_{\theta}(y_2, \theta_2)$$

- Handicaps: costs to planner due to asymmetric information

## Second Best: period-2 output

- Given  $\theta = (\theta_1, \theta_2)$ ,

$$1 = \psi_y(y_2, \theta_2) - \frac{1}{\gamma_1(\theta_1)} I_1^2(\theta, y_1(\theta_1)) \psi_{y\theta}(y_2, \theta_2)$$

- Value of distorting period-2 output at  $\theta = (\theta_1, \theta_2)$ : smaller rents to (period-1!) types  $\theta'_1 > \theta_1$ 
  - **impulse responses**

## Second Best: period-1 output

- Given  $\theta_1$ ,

$$\begin{aligned}
 & 1 + LD_1^x(\theta_1) \\
 &= \psi_y(y_1(\theta_1), \theta_1) - \frac{1}{\gamma_1(\theta_1)} \psi_{y\theta}(y_1(\theta_1), \theta_1) \\
 &+ \delta \frac{\partial}{\partial y_1} \mathbb{E}^{\lambda[x]|\theta_1, y_1(\theta_1)} \left[ \frac{I_1^2(\tilde{\theta}, y_1(\theta_1))}{\gamma_1(\theta_1)} \psi_{\theta}(y_2(\tilde{\theta}), \tilde{\theta}_2) \right]
 \end{aligned}$$

- Value of distorting period-1 output: smaller rents to higher (period-1) types
  - smaller rents in future periods
- Two channels through which LBD affects cost of future rents:
  - change in distribution of  $\theta_2$
  - change in impulse response of  $\theta_2$  to  $\theta_1$  (hence handicaps)

## Second Best: Labor Wedges

### Definition

Labor wedges:

$$W_1(\theta_1) \equiv 1 - \frac{\psi_y(y_1(\theta_1), \theta_1)}{1 + LD_1^x(\theta_1)} \text{ and } W_2(\theta) \equiv 1 - \psi_y(y_2(\theta), \theta_2).$$

- Relative wedges:

$$\widehat{W}_t \equiv \frac{W_t}{1 - W_t}$$

## Second Best: Wedges

### Proposition

*Under risk neutrality and Rawlsian objective,*

$$\widehat{W}_t \equiv \widehat{W}_t^{RRN} + \Omega_t$$

where

$$\widehat{W}_t^{RRN} \equiv - \frac{I_1^t(\theta^t, y^{t-1}(\theta^{t-1}))}{\gamma_1(\theta_1)} \frac{\psi_{y\theta}(y_t(\theta^t), \theta_t)}{\psi_y(y_t(\theta^t), \theta_t)}$$

are wedges without LBD and

$$\Omega_1 \equiv \delta \frac{\frac{\partial}{\partial y_1} \mathbb{E}^{\lambda[x]|\theta_1, y_1(\theta_1)} [h_2(\tilde{\theta}, y^t(\tilde{\theta}))]}{\psi_y(y_1(\theta_1), \theta_1)}$$

and

$$\Omega_2 \equiv 0$$

are corrections due to LBD



## Effects of LBD on wedges

- Suppose  $\psi(y_t, \theta_t) = \frac{1}{1+\phi} \left( \frac{y_t}{\theta_t} \right)^{1+\phi}$  and  $\theta_2 = \theta_1^\rho y_1^\zeta \varepsilon_2$
- Then
  - $\hat{W}_1(\theta_1) > \hat{W}_1^{RRN}(\theta_1)$
  - $\hat{W}_1(\theta_1) - \hat{W}_2(\theta) > \hat{W}_1^{RRN}(\theta_1) - \hat{W}_2^{RRN}(\theta)$
- When, in addition  $F_1$  has a Pareto tail progressivity of  $\hat{W}_1(\theta_1)$  higher than progressivity of  $\hat{W}_1^{RRN}(\theta_1)$  at tail

## Effects of LBD on wedges – Intuition

- LBD contributes to higher expected period-2 handicaps
  - ⇒ extra benefit of lowering  $y_1$
  - ⇒ higher wedges
- Expected period-2 rents increasing in  $\theta_1$ 
  - ⇒ benefit of distorting  $y_1$  downwards stronger for higher  $\theta_1$
  - ⇒ more progressivity
- Effects of LBD declining with  $t$ 
  - ⇒ wedges declining over life-cycle

# Pareto a-la Kapicka (2013)

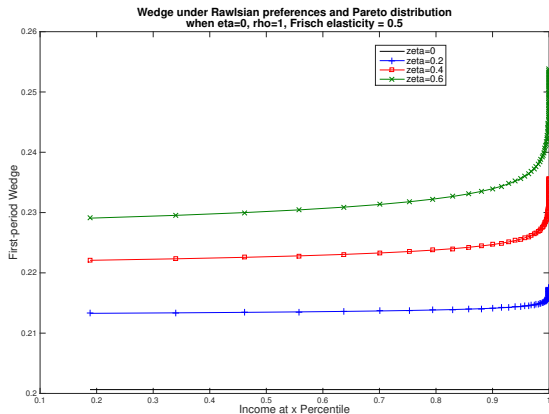


Figure: Period-1 wedges: risk-neutral Rawlsian Pareto case

# Pareto-log-normal a-la Diamond (1998)

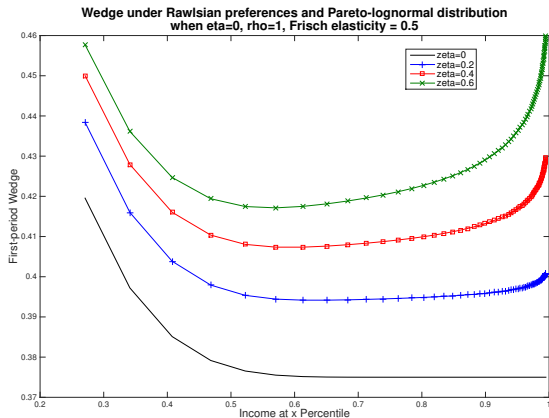


Figure: Period-1 wedges: risk-neutral Rawlsian Pareto-lognormal case

# Risk Aversion

- Agent's utility from consumption:  $v(c_t)$ , with  $v''(\cdot) < 0$
- One util compensation requires  $1/v'(c_t)$  units of consumption
- Risk aversion increases cost of future information rents
- Effect of LBD:  $RA(\theta_1)\Omega(\theta)$  where

$$RA(\theta_1) \equiv v'(c_1(\theta_1)) \int_{\theta_1}^{\bar{\theta}_1} \frac{1}{v'(c_1(s))} \frac{dF_1(s)}{1 - F_1(\theta_1)}$$

is correction due to risk-aversion

- Risk aversion contributes to **amplification** of LBD **level** effect
  - risk aversion increases benefit of shifting future distribution towards lower types
- Risk aversion contributes to **amplification** of LBD **progressivity** effect
  - benefit more pronounced for high period-1 types: their expected future rents are higher
- BUT, risk aversion leads also to an **alleviation** of LBD level and progressivity effects
  - higher cost of future rents  $\rightarrow$  lower future incomes (hence lower  $\Omega_1$ )

# Risk Aversion

The Correction term  
under Pareto-lognormal/Rawlsian and  $\rho=1$ , Frisch elasticity = 0.5

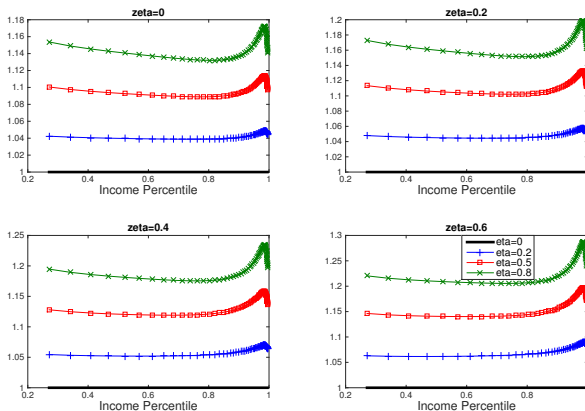


Figure: RA correction term: Rawlsian Pareto-lognormal case

# Risk Aversion

Risk aversion impact on Omega  
under Pareto-lognormal/Rawlsian and  $\rho=1$ , Frisch elasticity = 0.5

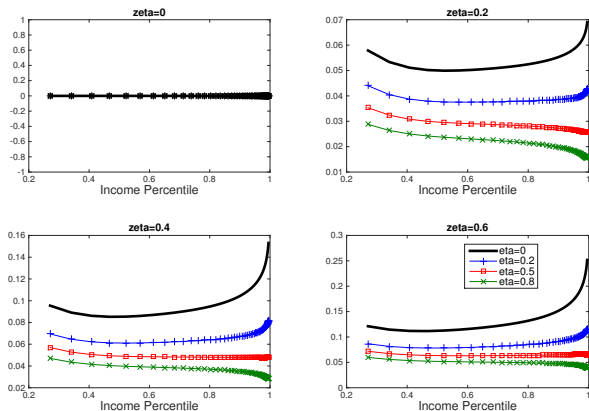


Figure: LBD term  $\Omega$ : Rawlsian Pareto-lognormal case

# Risk Aversion

Risk aversion effects on first-period wedge  
under Pareto-lognormal/Rawlsian and  $\rho=1$ , Frisch elasticity = 0.5

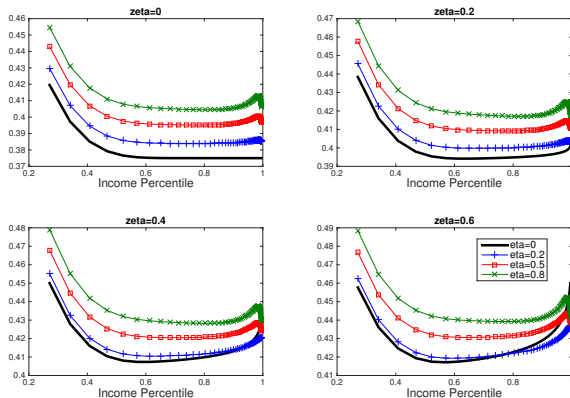


Figure: Period-1 wedges: risk-averse Rawlsian Pareto-lognormal case



# Utilitarian

- Redistribution constraint:

$$\int_{\underline{\theta}_1}^{\bar{\theta}_1} V_1(\theta_1) dF_1(\theta_1) \geq \kappa$$

- Increasing lifetime utility by  $v'(c_1(\theta_1))\Omega_1(\theta_1)$  now relaxes redistribution constraint

$$\widehat{W}_1(\theta_1) = \widehat{W}_1^{URA}(\theta_1) + [RA(\theta_1) - D(\theta_1)]\Omega(\theta_1),$$

where

$$D(\theta_1) \equiv v'(c_1(\theta_1)) \int_{\underline{\theta}_1}^{\bar{\theta}_1} \frac{1}{v'(c_1(s))} dF_1(s)$$

is novel correction term reflecting higher Pareto weights assigned to types above  $\underline{\theta}_1$

- Novel effect reduces amplification effect of risk aversion

# Utilitarian

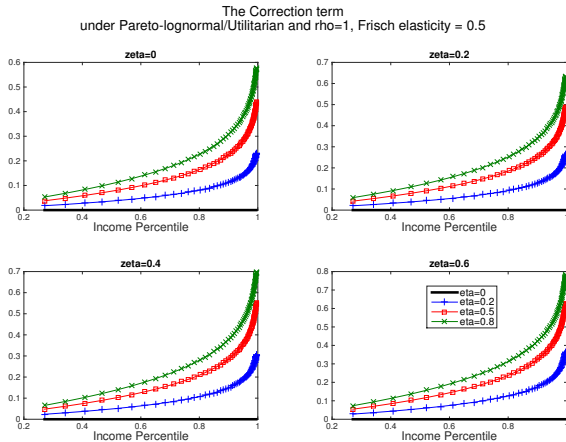


Figure:  $RA - D$  correction term: Utilitarian Pareto-lognormal case

# Utilitarian

Risk aversion impact on Omega  
under Pareto-lognormal/Utilitarian and  $\rho=1$ , Frisch elasticity = 0.5

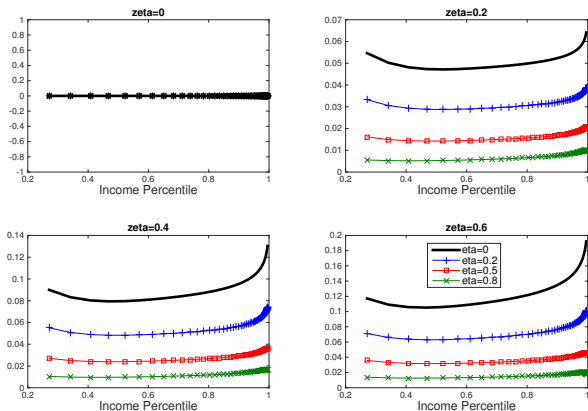


Figure: LBD term  $\Omega$ : Utilitarian Pareto-lognormal case

# Utilitarian

Risk aversion effects on first-period wedge  
under Pareto-lognormal/Utilitarian and  $\rho=1$ , Frisch elasticity = 0.5

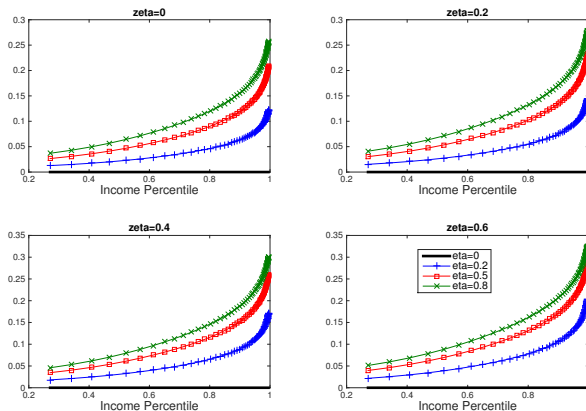


Figure: Period-1 wedges: Utilitarian Pareto-lognormal case

# Lognormal

Risk aversion effects on first-period wedge  
under Lognormal/Utilitarian and  $\rho=1$ , Frisch elasticity = 0.5

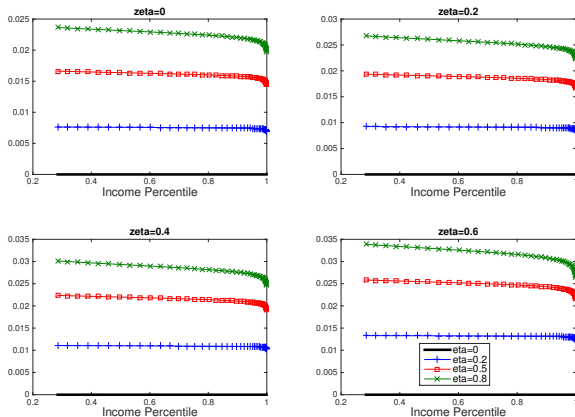


Figure: Period-1 wedges: Utilitarian Lognormal case

# Quantitative Analysis

- Calibrate 40-working-years model with productivity changing at year 21
- Annual discount factor  $\beta$
- LBD active in each of first 20 years (weights  $\beta^{s-1}$ )
- $\beta = 1/(1+r)$
- Isomorphic to 2-period model with  $\delta = \beta^{20}$  and  $V_t = \frac{\hat{V}_{20(t-1)+1}}{\sum_{s=1}^{20} \beta^{s-1}}$ ,  $t = 1, 2$ .
- U.S. income tax estimation from Heathcote et. al. (2016)

$$T(y) = y - e^{\tau_0} y^{1-0.181}$$

- $r = 0.04$ ,  $v = \log$ ,  $\phi = 2$   $\theta_1 = h_1 \varepsilon_1$ , and  $\varepsilon_t$  iid Pareto-Lognormal  $(\lambda, \sigma)$  with mean 1

# Quantitative Analysis

| Definition                 | Symbol   | Value     | As in             |
|----------------------------|----------|-----------|-------------------|
| CRRA parameter             | $\eta$   | 1         | FW, K, GTT, S, KN |
| Frisch elasticity of labor | $1/\phi$ | 0.5       | FW, GTT, S, BK    |
| Annual interest rate       | $r$      | 4%        | KN                |
| Annual discount factor     | $\beta$  | $1/(1+r)$ | FW, K, GTT, S, BK |
| Working years per period   | —        | 20        | BK, KN            |
| Cutoff year                | —        | 21        | BK                |

Table: Exogenous parameters

# Quantitative Analysis

Using estimated moments in (Huggett et. al. 2011)

| Symbol    | Value  | Target Moment                 | Data   | Abs Perc. Deviation |
|-----------|--------|-------------------------------|--------|---------------------|
| $\rho$    | 0.4505 | mean earnings ratio           | 0.868  | 0.0015%             |
| $\zeta$   | 0.2175 | Var. log-earnings young       | 0.335  | 1%                  |
| $h_1$     | 0.4795 | Var. log-earnings old         | 0.435  | 0.009%              |
| $\sigma$  | 0.5573 | Gini earnings young           | 0.3175 | 1.7%                |
| $\lambda$ | 5.9907 | mean-to-median earnings young | 1.335  | 1.25%               |

Table: Calibrated Parameters



# Quantitative Analysis

- Optimal reform: 4.0348% increase in consumption at all histories
- For some histories, wedges decreasing over time
- For other histories, wedges are increasing over time
- Conditional average period-2 wedge higher than period-1 wedge
- Unconditional average period-2 wedge (0.4854) higher than unconditional period-1 wedge (0.3733)
- Inverse U-shape wedges as functions of (conditional) income percentile
  - shock distribution close to Lognormal
  - very high risk aversion
  - low-end LBD factor
  - moderate skill persistence

# Quantitative Analysis

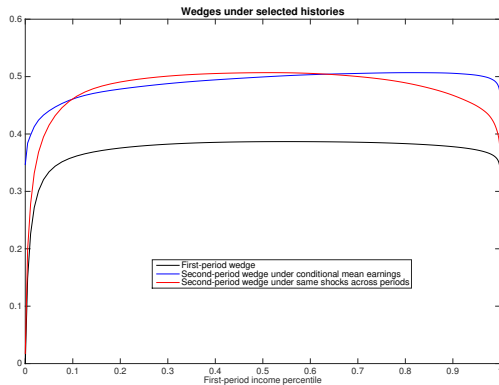
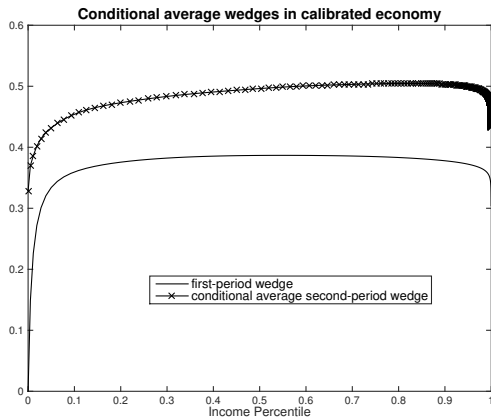


Figure: Optimal wedges for selected histories

# Quantitative Analysis



**Figure:** Period-1 wedges and conditional period-2 wedges as a function of period-1 income percentile.

# Quantitative Analysis

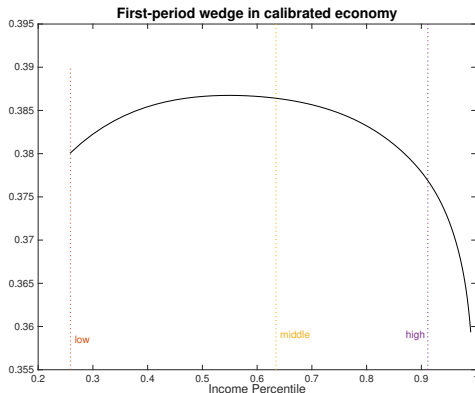
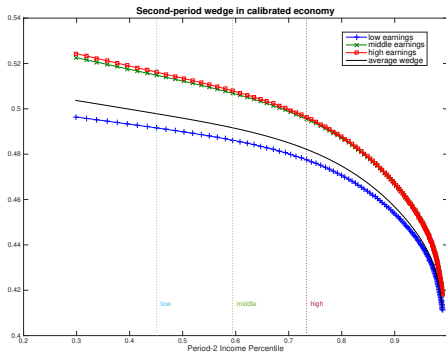


Figure: Period-1 optimal wedge. Vertical lines indicate period-1 income percentiles corresponding to low, middle, and high earnings.

# Quantitative Analysis



**Figure:** Period-2 wedges as function of period-2 earnings percentiles for (a) low, middle and high period-1 earnings, and (b) weighted average of period-1 productivities.

# Taxes

- Optimal allocations implemented arbitrarily well by **age-dependent taxes invariant in past incomes**:

$$T_1(y_1) = -B + y_1 - e^{\tau_{0,1}} y_1^{1-\tau_1}$$

and

$$T_2(y_2) = y_2 - e^{\tau_{0,2}} y_2^{1-\tau_2}$$

- Loss in consumption (relative to SB): 0.1489%
- Optimal **linear** age-dependent taxes  $t_1 = 38\%$  and  $t_2 = 46\%$ 
  - loss in consumption (relative to SB): 0.1506%
- Optimal **linear age-independent** linear tax rate: 41.25%
  - loss in consumption (relative to SB): 0.2361%

# Taxes

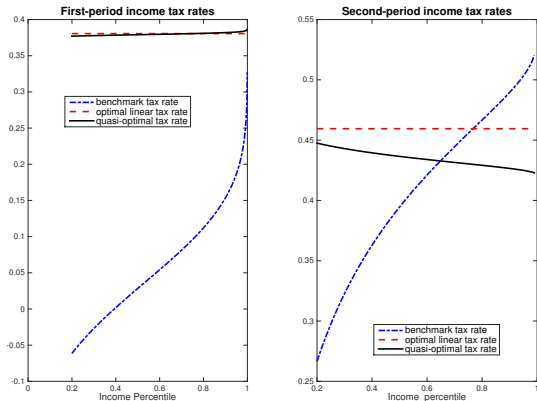


Figure: Tax rates as functions of income

# Importance of LBD

- Similar calibration but with **exogenous productivity**

$$\theta_2 = h_2 \theta_1^{\hat{p}} \varepsilon_2$$

- Calibrated (conditional) distributions very close to those under LBD
- Optimal allocations implemented arbitrarily well by age-dependent taxes invariant in past incomes
- Ignoring LBD: 15% overestimation of benefits of reforming US tax code



# Importance of LBD

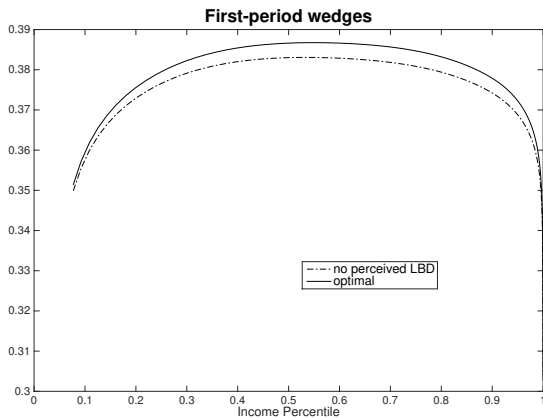


Figure: First-period wedges with and without LBD

# Importance of LBD

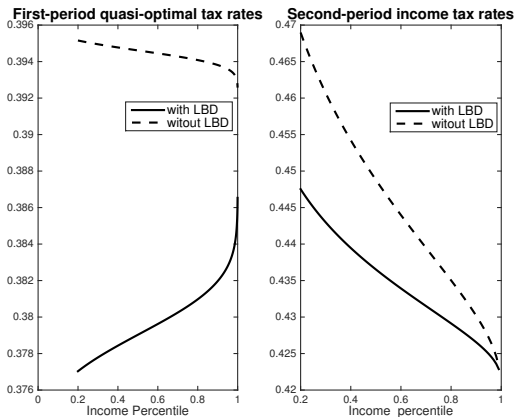


Figure: Quasi-optimal income tax rates with and without LBD

# Conclusions

- LBD: important qualitative and quantitative implications
  - level
  - progressivity
  - dynamics
  - benefits of reforming US tax code
- Ongoing work
  - arbitrary horizons (recursive approach)
  - general wedge decomposition
- Future work:
  - hidden savings
  - political economy constraints
  - partial commitment
  - ...

**THANKS!**

## Second Best: Incentive Compatibility

- Continuation utility (history  $\theta = (\theta_1, \theta_2)$ ):

$$V_2(\theta) \equiv c_2(\theta) - \psi(y_2(\theta), \theta_2)$$

- For any  $\theta_1$ , IC-2 requires that
  - $V_2(\theta_1, \cdot)$  Lipschitz continuous and s.t. (e.g., Mirrlees)

$$V_2(\theta_1, \theta_2) = V_2(\theta_1, \underline{\theta}_2) - \int_{\underline{\theta}_2}^{\theta_2} \psi_{\theta}(y_2(\theta_1, s), s) ds,$$

- $y_2(\theta_1, \cdot)$  nondecreasing

## Second Best: Incentive Compatibility

- IC-1 requires that

$$V_1(\theta_1) = V_1(\underline{\theta}_1)$$

$$- \int_{\underline{\theta}_1}^{\theta_1} \left\{ \psi_{\theta}(y_1(s), s) ds + \delta \mathbb{E}^{\lambda[x]|s} \left[ I_1^2(\tilde{\theta}, y_1(s)) \psi_{\theta}(y_2(\tilde{\theta}), \tilde{\theta}_2) \right] \right\} ds$$

and

$$\begin{aligned} & \int_{\hat{\theta}_1}^{\theta_1} \left\{ \psi_{\theta}(y_1(s), s) + \delta \mathbb{E}^{\lambda[x]|s, y_1(s)} \left[ I_1^2(\tilde{\theta}, y_1(s)) \psi_{\theta}(y_2(s, \tilde{\theta}_2), \tilde{\theta}_2) \right] \right\} ds \\ & \leq \int_{\hat{\theta}_1}^{\theta_1} \left\{ \psi_{\theta}(y_1(\hat{\theta}_1), s) + \delta \mathbb{E}^{\lambda[x]|s, y_1(\hat{\theta}_1)} \left[ I_1^2(\tilde{\theta}, y_1(\hat{\theta}_1)) \psi_{\theta}(y_2(\hat{\theta}_1, \tilde{\theta}_2), \tilde{\theta}_2) \right] \right\} ds \end{aligned}$$

# Sufficient Statistics

- Let

$$\hat{E}_1(y_1) \equiv \frac{1 - \tau_1(y_1)}{y_1} \frac{\partial \hat{y}_1(1 - \tau_1(y_1), \theta_1(y_1))}{\partial (1 - \tau_1)}$$

$$e_{\mathcal{T}_2|y_1} \equiv \frac{\partial \mathbb{E}[\tilde{\mathcal{T}}_2|y_1]}{\partial y_1} \frac{y_1}{\mathbb{E}[\tilde{\mathcal{T}}_2|y_1]}$$

## Proposition

*Under the optimal tax code*

$$\frac{\tau_1(y_1)}{1 - \tau_1(y_1)} = \frac{1 - H_Y(y_1)}{y_1 \hat{h}_Y(y_1)} \frac{1}{\hat{E}_1(y_1)} \left[ \frac{1}{1 + \delta e_{\mathcal{T}_2|y_1} \frac{\mathbb{E}[\tilde{\mathcal{T}}_2|y_1]}{\tau_1(y_1) y_1}} \right].$$

# Sufficient Statistics

- Let

$$\hat{E}_2(y_1, y_2) \equiv \frac{1 - \tau_2(y_1, y_2)}{y_2} \frac{\partial \hat{y}_2(1 - \tau_2(y_1, y_2), \theta_2(y_1, y_2))}{\partial (1 - \tau_2)}$$

## Proposition

*Under optimal tax code*

$$\frac{\tau_2(y_1, y_2)}{1 - \tau_2(y_1, y_2)} = \left[ \frac{\partial \tilde{H}_O(y_2|y_1)}{\partial y_1} - \frac{\partial H_O(y_2|y_1)}{\partial y_1} \right] \frac{1 - H_Y(y_1)}{h_Y(y_1)y_2\hat{h}_O(y_2|y_1)} \frac{1}{\hat{E}_2(y_1, y_2)}$$

- Results established with novel perturbations (reforms) accounting for endogeneity of period-2 productivity