# PhD Topics in Macroeconomics Lecture 11: misallocation, part three

Chris Edmond

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#### This lecture

Peters (2013) model of endogenous misallocation

- **1-** static implications of variable markups
- 2- dynamics in a quality ladder model
- **3-** empirical implications using Indonesian data (brief remarks)

## Overview

#### • Background

- Hsieh/Klenow takes marginal product gaps etc as exogenous
- firms with higher TFPR are more 'constrained'
- Peters alternative: misallocation through endogenous markups
  - quality ladder model with entry (simplified Klette/Kortum)
  - markups depend on productivity gap between incumbent and rivals
  - incumbent and entrant innovation determines productivity gaps
  - implied markup distribution is Pareto, thicker tails when low entry

#### Model

- Continuous time  $t \ge 0$
- Final output

$$\log Y_t = \int_0^1 \log \left[ \sum_{k=0}^{J_t(j)} y_t(j,k) \right] dj$$

horizontally differentiated intermediate goods  $j \in [0, 1]$ , each of which comes in  $k \in \{0, 1, ...\}$  vertically differentiated vintages

- Note: *imperfect* horizontal differentiation (elasticity of subs. = 1) but *perfect* vertical differentiation (elasticity of subs. =  $\infty$ )
- Intermediate of productivity *a* produces with capital and labor

$$y = ak^{\alpha}l^{1-\alpha}, \qquad 0 < \alpha < 1$$

taking input prices r and w as given

## Costs and pricing

• Marginal cost of intermediate producer with productivity a

$$\frac{c(w,r)}{a}, \qquad c(w,r) := \left(\frac{w}{1-\alpha}\right)^{1-\alpha} \left(\frac{r}{\alpha}\right)^{\alpha}$$

• Most efficient producer takes whole market and *limit prices*, price equal to marginal cost of *second-best* producer

## Markup

• Hence best producer has price

$$p^1 = \frac{c(w,r)}{a^2}$$

where  $a^2$  is the productivity of the second-best producer

• Then best producer has *markup* equal to its relative productivity

$$m := \frac{p^1}{c(w,r)/a^1} = \frac{a^1}{a^2}$$

High productivity differential effectively shields from competition

### Aside on demand elasticity

- Suppose we instead had CES demand with elasticity  $\sigma > 1$
- Unconstrained monopoly price

$$p^* = \frac{\sigma}{\sigma - 1} \frac{c(w, r)}{a^1}$$

• Then best producer has price equal to the min of the monopoly price and the limit price

$$p^{1} = \min\left[p^{*}, \frac{c(w, r)}{a^{2}}\right] = \min\left[\frac{\sigma}{\sigma - 1}\left(\frac{a^{2}}{a^{1}}\right), 1\right]\frac{c(w, r)}{a^{2}}$$

• Producer with large enough productivity advantage  $(a^2/a^1 \text{ small})$ might still be able to set unconstrained monopoly price

#### Static allocation

For intermediate good j with market taken by  $a^1(j)$  producer

$$y(j) = \frac{1}{c(w,r)} \frac{a^1(j)}{m(j)} PY, \qquad m(j) = \frac{a^1(j)}{a^2(j)}$$

$$k(j) = \alpha \frac{c(w,r)}{a^1(j)r} y(j) = \frac{1}{m(j)} \frac{\alpha}{r} PY$$

$$l(j) = (1 - \alpha) \frac{c(w, r)}{a^1(j)w} y(j) = \frac{1}{m(j)} \frac{(1 - \alpha)}{w} PY$$

$$\pi(j) = \left(p(j) - \frac{c(w,r)}{a^1(j)}\right)y(j) = \left(\frac{m(j) - 1}{m(j)}\right)PY$$

## TFPR

- Physical productivity of a producer is just  $a^1(j)$
- Revenue productivity is

 $p(j)a^{1}(j) = c(w, r)m(j)$ 

- Since c(w, r) is common, all cross-sectional variation in TFPR is coming from markup variation (i.e., relative productivity variation)
- In Hsieh/Klenow all cross-sectional variation in TFPR is coming from  $(\tau_K, \tau_Y)$  variation and high TFPR indicates more distorted ('constrained') firms

## Aggregation

• Define aggregate productivity by

$$A:=\frac{Y}{K^{\alpha}L^{1-\alpha}}$$

where K and L are aggregate capital and labor used in production

• Summing input demands over intermediate producers

$$K = \int_0^1 k(j) \, dj = \frac{\alpha}{r} PY \int_0^1 \frac{1}{m(j)} \, dj$$
$$L = \int_0^1 l(j) \, dj = \frac{1 - \alpha}{w} PY \int_0^1 \frac{1}{m(j)} \, dj$$

## Aggregate TFPR

• Taking the geometric average of K and L

$$K^{\alpha}L^{1-\alpha} = \left(\frac{\alpha}{r}\right)^{\alpha} \left(\frac{1-\alpha}{w}\right)^{1-\alpha} \left(\int_0^1 \frac{1}{m(j)} \, dj\right) PY$$

where the coefficient out the front is just 1/c(w, r)

• Hence aggregate TFPR is

$$PA = \frac{PY}{K^{\alpha}L^{1-\alpha}} = c(w,r) \left(\int_0^1 \frac{1}{m(j)} dj\right)^{-1}$$

• Need to decompose this into P and A using price index

#### Aggregate price index P

• With Cobb-Douglas preferences over the intermediates

$$\log P = \int_0^1 \log p(j) \, dj$$

(this is the limit of the usual CES index as  $\sigma \to 1^+$ )

• Plugging in for individual prices

$$\log P = \int_0^1 \log\left(m(j)\frac{c(w,r)}{a^1(j)}\right) dj$$

or

$$P = c(w, r) \exp\left(\int_0^1 \log\left(\frac{m(j)}{a^1(j)}\right) dj\right)$$

## Aggregate productivity A

• Hence we can write aggregate productivity as

$$A = \frac{\exp\left(\int_0^1 \log\left(\frac{a^1(j)}{m(j)}\right) dj\right)}{\int_0^1 \frac{1}{m(j)} dj} = \bar{A}D,$$

product of benchmark productivity  $\overline{A}$  and distortion index D

• *Benchmark productivity* (first-best productivity)

$$\bar{A} := \exp\left(\int_0^1 \log a^1(j) \, dj\right)$$

• Distortion index

$$D := \exp\left(-\int_0^1 \log m(j) \, dj\right) \Big/ \int_0^1 \frac{1}{m(j)} \, dj$$

#### **TFP** distortion index

• Write the TFP distortion index as

$$D = \frac{\exp\left(-\mathbb{E}[\log m]\right)}{\mathbb{E}[1/m]}$$

- By Jensen's inequality  $D \leq 1$  and = 1 only if m degenerate
- Is homogeneous degree zero in m: a pure level shift in markups <u>does not</u> reduce aggregate productivity
- Is decreasing in a mean-preserving-spread of log m: more dispersed markups <u>do</u> reduce aggregate productivity

#### Factor price distortion

• The denominator is the distortion to factor prices, that is

$$r = \bar{r} \exp\left(\mathbb{E}[1/m]\right), \qquad w = \bar{w} \exp\left(\mathbb{E}[1/m]\right)$$

where  $\bar{r}$  and  $\bar{w}$  are the factor prices that would obtain in the absence of markup distortions

- Is homogeneous degree one in 1/m: a pure level shift in markups reduces factor prices
- Is invariant to a mean-preserving-spread of 1/m
- In short, (i) markup dispersion matters for TFP but not factor prices, (ii) markup level matters for factor prices but not TFP

Consider monopolistically competitive CES case: common markup  $\sigma/(\sigma-1)$  leaves TFP unchanged but reduces factor prices

#### Quality ladder dynamics

- Firm productivity follows ladder with constant step-size q > 1
- If producer has had  $n_t(j)$  innovations at t, their productivity is

$$a_t(j) = q^{n_t(j)}$$

• Markup is therefore

$$m_t(j) = \frac{a_t^1(j)}{a_t^2(j)} = \frac{q^{n_t^1(j)}}{q^{n_t^2(j)}} = q^{\Delta_t(j)}, \qquad \Delta := n^1 - n^2 \ge 1$$

• Entry gives access to the current leading technology

$$qa_t^1(j)$$

### **Innovation and markups**

Note contrast:

- Incumbent innovation: increases  $a^1$  relative to  $a^2$ , increases markup by factor q > 1
- Entrant innovation: decreases markup, by factor  $q^{\Delta-1}$
- Innovating incumbent may be multiple steps ahead, innovating entrant is only one step ahead
- Why will incumbent innovate? (cf., simple quality ladder model)

# Quality gap dynamics

- Let  $\lambda$  denote incumbent innovation rate and let  $\eta$  denote entry rate (both endogenous, will be constant along balanced growth path)
- Let  $M_t(\Delta)$  denote measure of intermediates with quality gap  $\Delta$
- Law of motion

$$\dot{M}_t(\Delta) = -(\eta + \lambda)M_t(\Delta) + \lambda M_t(\Delta - 1), \quad \text{for } \Delta \ge 2$$

and

$$\dot{M}_t(1) = -(\eta + \lambda)M_t(1) + \eta$$

#### Stationary quality gap distribution

• Setting 
$$\dot{M}_t(\Delta) = 0$$
 for each t we have

$$M(1) = \frac{\eta}{\eta + \lambda}$$

and

$$M(\Delta) = \frac{\lambda}{\eta + \lambda} M(\Delta - 1), \quad \text{for } \Delta \ge 2$$

• Iterating backwards we get

$$M(\Delta) = \left(\frac{\lambda}{\eta + \lambda}\right)^{\Delta - 1} \frac{\eta}{\eta + \lambda}$$

$$= \left(\frac{\lambda}{\eta + \lambda}\right)^{\Delta} \frac{\eta}{\lambda} = \left(\frac{1}{1 + \theta}\right)^{\Delta} \theta, \qquad \theta := \frac{\eta}{\lambda}$$

## Quality gaps and markup distribution

• Cumulative quality gap distribution

$$F_{\Delta}(n) := \operatorname{Prob}[\Delta \le n] = \sum_{k=1}^{n} M(k) = 1 - \left(\frac{1}{1+\theta}\right)^{n}$$

• Markup distribution is Pareto

$$F(m) := \operatorname{Prob}[q^{\Delta} \le m] = \operatorname{Prob}[\Delta \le \log m / \log q]$$

$$= 1 - m^{-\xi(\theta)}, \qquad \xi(\theta) := \frac{\log(1+\theta)}{\log q}$$

with shape  $\xi(\theta)$  given by *entry intensity*  $\theta := \eta/\lambda$  (rate of entrant innovation to incumbent innovation, as in Klette/Kortum)

Distortion index  $D := \exp\left(-\mathbb{E}[\log m]\right)/\mathbb{E}[1/m]$ 

• Two statistics to calculate

$$\mathbb{E}[1/m] = \mathbb{E}[q^{-\Delta}] = \sum_{\Delta=0}^{\infty} q^{-\Delta} M(\Delta) = \frac{\theta}{(q-1) + q\theta}$$

and

$$\mathbb{E}[\log m] = \mathbb{E}[\Delta \log q] = (\log q) \sum_{\Delta=0}^{\infty} \Delta M(\Delta) = (\log q) \left(\frac{\theta+1}{\theta}\right)$$

• Then distortion index is

$$D(\theta) = \frac{\exp(-\mathbb{E}[\log m])}{\mathbb{E}[1/m]} = q^{-\frac{\theta+1}{\theta}} \frac{(q-1) + q\theta}{\theta}$$

and determined by entry intensity  $\theta=\eta/\lambda$ 

## **Continuous approximation**

• Approximate formulas treating markups as continuous

$$\mathbb{E}[1/m] \approx \int_{1}^{\infty} (1/m) \, dF(m) = \int_{1}^{\infty} (1/m)\xi(\theta)(1/m)^{\xi(\theta)+1} \, dm$$
$$= \frac{\xi(\theta)}{\xi(\theta)+1}$$

and

$$\mathbb{E}[\log m] \approx \int_{1}^{\infty} (\log m) \, dF(m) = \int_{0}^{\infty} z \, \exp(-\xi(\theta)z) \, dz$$
$$= \frac{1}{\xi(\theta)}$$

using that  $z = \log m$  has an exponential distribution

• Gives distortion index

$$D(\theta) \approx \exp\left(-\frac{1}{\xi(\theta)}\right) \frac{\xi(\theta) + 1}{\xi(\theta)}$$

## Effects of higher entry

A higher entry intensity  $\theta = \eta / \lambda$ :

- Reduces F(m) in FOSD sense  $(F(m) \text{ increasing in } \theta \text{ for all } m)$
- Increases  $\xi(\theta)$  and hence reduces markup dispersion
- Reduces wedge between A and first-best  $\overline{A}$ , thereby increasing aggregate productivity
- Reduces wedge between factor prices and marginal products

Now need to actually pin down innovation rates  $\eta, \lambda$ 

#### Innovation and entry costs

• Convex innovation cost function for incumbents

$$C(\lambda, \Delta) = q^{-\Delta} \lambda^{\gamma}, \qquad \gamma > 1$$

- This is the amount of labor required for an incumbent with advantage  $\Delta$  to generate flow innovation rate  $\lambda$
- Workers generate ideas with Poisson intensity 1 (normalization), 'blueprint' operational after paying fixed cost  $f_e > 0$  units of labor

#### HJB for incumbents

• Let  $V_t(\Delta)$  denote value of a firm with current quality gap  $\Delta$ 

$$(r+\eta)V_t(\Delta) = \pi_t(\Delta) + \max_{\lambda \ge 0} \left[\lambda(V_t(\Delta+1) - V_t(\Delta)) - w_t q^{-\Delta}\lambda^{\gamma}\right] + \dot{V}_t(\Delta)$$

• Along BGP, value function has the form

$$V_t(\Delta) = (v_0 - v_1 q^{-\Delta})e^{gt}$$

for some constants  $v_0, v_1, g$  to be determined

• Let  $\hat{V}(\Delta), \hat{\pi}(\Delta), \hat{w}$  etc denote variables relative to  $Y_t$  on BGP

#### **Rescaled** problem

• So relative to the BGP

$$(r+\eta-g)\hat{V}(\Delta) = (1-q^{-\Delta}) + q^{-\Delta}\max_{\lambda \ge 0} \left[\lambda v_1 \frac{q-1}{q} - \hat{w}\lambda^{\gamma}\right]$$

where  $\hat{\pi}(\Delta) = (1 - q^{-\Delta})$  is instantaneous profits

• Hence the incumbent innovation rate  $\lambda$  is independent of  $\Delta$  and solves the first order condition

$$v_1 \frac{q-1}{q} = \hat{w}\gamma \lambda^{\gamma-1}$$

Plugging back into the HJB allows us to solve for the coefficients v<sub>0</sub>, v<sub>1</sub> (and hence λ) in terms of the aggregates (w, η, etc)

#### Solution to rescaled problem

• The intercept is

$$v_0 = \frac{1}{r + \eta - g}$$

• The slope  $v_1$  implicitly solves

$$(r+\eta-g)v_1 = 1 - (\gamma-1)\hat{w}\left(rac{q-1}{q}rac{v_1}{\gamma\hat{w}}
ight)^{1/(\gamma-1)}$$

• Innovation intensity is then

$$\lambda = \left(\frac{q-1}{q}\frac{v_1}{\gamma\hat{w}}\right)^{1/(\gamma-1)}$$

(all these depend on the aggregate  $w, \eta$ , etc)

## General equilibrium

• Representative consumer with preferences over final good

$$U = \int_0^\infty e^{-\rho t} \log C_t \, dt$$

and inelastic labor supply L > 0

• Along a BGP we then have

$$r = \rho + g$$

• With constant quality step q and constant innovation rates

$$g = \frac{1}{1 - \alpha} (\log q) (\lambda + \eta)$$

• To complete the solution of the model, need to solve for aggregate  $\lambda, \eta$  etc along this BGP

• Back to the incumbent value function, we now have the intercept

$$v_0 = \frac{1}{r+\eta-g} = \frac{1}{\rho+\eta} =: v_0(\eta)$$

• And the slope  $v_1(\eta, \hat{w})$  solves

$$(\rho + \eta)v_1 = 1 - (\gamma - 1)\hat{w}\left(\frac{q - 1}{q}\frac{v_1}{\gamma\hat{w}}\right)^{1/(\gamma - 1)}$$

and then recover  $\lambda(\eta, \hat{w})$  from the first order condition

• EXAMPLE: in the special case of  $C(\cdot)$  quadratic in  $\lambda$ , i.e.,  $\gamma = 2$ , can solve for  $v_1$  explicitly

$$v_1 = \frac{1}{\rho + \eta + \frac{1}{2}\frac{q-1}{q}},$$
 (independent of  $\hat{w}$ , in this case)

## Equilibrium

• Constants

$$(\eta^*, \hat{w}^*)$$

consistent with firm optimization, i.e.,  $v_0(\eta), v_1(\eta, \hat{w}), \lambda(\eta, \hat{w})$ , and

(i) free entry condition

 $(v_0 - v_1 q^{-1}) \le \hat{w} f_e$ 

(ii) labor market clearing

 $L_X + L_R + L_S = L$ 

• Compute equilibrium by solving fixed point problem in  $\hat{w}, \eta$ Then implies innovation intensity  $\lambda^* = \lambda(\eta^*, \hat{w}^*)$  etc • Labor employed in goods production

$$L_X = \sum_{\Delta=1}^{\infty} l_X(\Delta) M(\Delta), \qquad l_X(\Delta) = q^{-\Delta} \frac{1-\alpha}{\hat{w}}$$
$$= \frac{1-\alpha}{\hat{w}} \sum_{\Delta=1}^{\infty} q^{-\Delta} M(\Delta) = \frac{1-\alpha}{\hat{w}\hat{m}}$$

where the *aggregate markup*,  $\hat{m}$  is given by

$$\hat{m} := \left(\sum_{\Delta=1}^{\infty} q^{-\Delta} M(\Delta)\right)^{-1} = (q-1)\frac{\lambda}{\eta} + q =: m(\lambda, \eta)$$

• Labor employed in research at incumbents

$$L_R = \sum_{\Delta=1}^{\infty} l_R(\Delta) M(\Delta), \qquad l_R(\Delta) = C(\lambda, \Delta) = q^{-\Delta} \lambda^{\gamma}$$
$$= \lambda^{\gamma} \sum_{\Delta=1}^{\infty} q^{-\Delta} M(\Delta) = \frac{\lambda^{\gamma}}{m(\lambda, \eta)}$$

#### Computing an equilibrium: summary

• Labor employed at startups

$$L_S = \eta f_e$$

• Hence labor market clearing condition is

$$\frac{1}{m\left(\lambda(\eta,\hat{w}),\eta\right)}\left(\frac{1-\alpha}{\hat{w}}+\lambda(\eta,\hat{w})^{\gamma}\right)+\eta f_e=L \qquad (*)$$

and the free entry condition is

$$(v_0(\eta) - v_1(\eta, \hat{w})q^{-1}) \le \hat{w}f_e$$
 (\*\*)

• Given  $v_0(\eta), v_1(\eta, \hat{w}), \lambda(\eta, \hat{w}), m(\lambda, \eta)$  already determined, now solve these two equations for the two remaining unknowns,  $\eta, \hat{w}$ 

## **Empirical implications**

- Markups proportional to revenue productivity
- Entry vs. markup level, dispersion

## Indonesian data

#### • Manufacturing

- annual census 1991–2000
- manufacturing plants > 20 employees
- revenue, wage bill, productions and non-production workers, capital stock, entry, region
- trim 1% tails
- Geographic information
  - -240 regencies aggregated to 33 provinces
  - other geographic/regional controls from Village Potential Statistics aggregated to province

#### **Entrants and TFPR**

	Dep. Variable: Labor productivity $ln(\frac{py}{wl})$							
			Full Sample			Census Sup	plement	199
Entrant	-0.0424*** (0.00700)							
Exiter		-0.0667*** (0.00738)						
Age			0.00680*** (0.00170)					
Positive Growth				$0.252^{***}$ (0.00409)				
Exporter					$0.0981^{***}$ (0.00642)			
Profit growth						0.0775*** (0.0115)		
R&D spending							0.123 ( $0.053$	** 33)
ln(k/l)	0.138*** (0.00188)	0.137*** (0.00185)	$0.137^{***}$ (0.00285)	$0.136^{***}$ (0.00176)	0.136*** (0.00179)	$0.162^{***}$ (0.00496)	$0.161^{*}$ (0.004	*** 95)
N	159678	159674	73657	173863	173863	20854	2085	54
$R^2$	0.163	0.162	0.163	0.180	0.163	0.210	0.20	8

Entrants have lower revenue productivity (markups) than incumbents. Revenue productivity tends to increase with age and to be higher in growing firms.

## Lifecycle of TFPR



Revenue productivity (markups) low on entry (relative to average) but increasing with age. Cohort size shrinks with attrition. Size proportional to dot.

### Entry and markup distribution



Low entry regions (below median) have thicker tail of markups compared to high entry regions (above median).

## Entry and markup distribution

	Avg. log mark-up				
	All products			Differentiated	
					products
Entry	$-0.135^{***}$	$-0.145^{***}$	-0.134***	-0.120***	-0.131**
	(0.0409)	(0.0404)	(0.0414)	(0.0415)	(0.0553)
(ln) population		-0.0254	-0.0307*	-0.0147	-0.00581
		(0.0154)	(0.0174)	(0.0164)	(0.0132)
Agricultural			-0.0772	-0.112	-0.0598
employmment share			(0.0655)	(0.101)	(0.0789)
Share of villages				-0.000230	0.00807
with banks				(0.0116)	(0.00942)
Share of villages				-0.0237	-0.00725
with BRI branch				(0.0840)	(0.0928)
Share of villages				-0.549**	-0.607**
with accessible markets				(0.221)	(0.229)
N	4480	4480	4480	4480	2972
R <sup>2</sup>	0.006	0.010	0.015	0.036	0.059

Higher entry rates associated with lower average markups (revenue productivity) controlling for various regional characteristics.

## Entry and markup distribution

	Other moments of log mark-up distribution				
	Quantiles				Standard
	25%	50%	75%	90%	deviation
Entry	-0.126**	-0.106**	-0.123**	-0.0792	0.0300
	(0.0478)	(0.0400)	(0.0511)	(0.0521)	(0.0345)
(ln) population	-0.0441***	-0.0313*	0.00384	0.0514*	0.0243
	(0.0142)	(0.0171)	(0.0293)	(0.0291)	(0.0150)
Agricultural	0.0525	-0.128	-0.347**	-0.471***	-0.328***
employmment share	(0.0917)	(0.102)	(0.143)	(0.159)	(0.0604)
Share of villages	0.00339	-0.00453	-0.00164	-0.00599	-0.0104
with banks	(0.0101)	(0.0121)	(0.0176)	(0.0200)	(0.00823)
Share of villages	0.0891	-0.00191	-0.167	-0.318*	-0.237*
with BRI branch	(0.0845)	(0.0929)	(0.127)	(0.175)	(0.117)
Share of villages	-0.188	-0.607**	-1.043***	-1.208***	-0.548***
with accessible markets	(0.249)	(0.231)	(0.235)	(0.246)	(0.143)
N	4480	4480	4480	4480	3645
$R^2$	0.169	0.059	0.169	0.247	0.427

But effect fairly uniform across distribution. Contrary to model, no evidence of higher entry rates being associated with reduction in markup dispersion.

#### Next

- Misallocation, part four
- Financial frictions, misallocation, and 'growth miracles'
  - ♦ BUERA AND SHIN (2013): Financial frictions and the persistence of history: A quantitative exploration, *Journal of Political Economy*.