Productivity and Quality in Health Care: Evidence from the Dialysis Industry

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November 15, 2012

Health Care Expenditures are Rising

- Health care expenditures are rising faster than income in most developed countries.
- Policy makers are looking for mechanisms to slow the increase in health care costs by incentivizing productivity.
 - Medicare Prospective Payment System (PPS): Pay for medical care on the basis of diagnosis, not on cost of treatment provided.
 - In the private sector, HMOs operate in a similar manner.
 - Proponents of increased competition argue that medical services will compete on price and eliminate "wasteful procedures."

Our Questions:

What could go wrong?

- Being an experience good, it can be difficult for consumers or regulators to observe quality of care.
- If we give providers incentives to be more "productive", will they respond by lowering quality?

Empirical question 1: Is it costly for medical personnel to exert effort to increase quality?

Empirical question 2: Do they adjust the effort on the basis of incentives?

Basic Approach

- Focus on the US Dialysis Industry
 - Relatively homogeneous service with clear measure of output quantities.
 - Clear capital and labor measures.
 - Stand-alone facilities, so no cross-subsidization issues as in hospitals.
 - Prices set by Medicare, independent of quality of care.
- Consistently estimate a production function augmented to include quality effort.
- Estimate quality policy functions controlling for center productivity.

Challenges

- Quality (and input choices) are endogenous.
 - Adapt Olley-Pakes (OP) and Ackerberg, Caves, Frazer (ACF) models for use in dialysis industry.
- Quality is not directly observed.
 - Proxy for quality effort with outcome measure (infection rate) and correct for measurement error by using a second outcome measure as an instrument.

Preview of Results

Quality is Costly:

Holding quality and capital fixed, raising output 1.2 percent would require a 5 percent increase in labor inputs. Hiring one additional part time worker for average staff levels.

Firms with stronger profit incentive offer lower quality:

 Non-Profit Centers have infection rates 1.3 percentage points (more than 10 percent) lower than for-profit centers.

Competition does not seem to incentivize higher quality:

Centers in monopoly markets do not have lower quality.

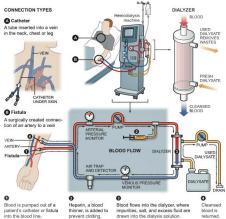
Related Work

- Production Function Estimation: Olley and Pakes (1996),
 Levinsohn and Petrin (2003) Ackerberg, Caves, and Fraizer (2006); Gandhi, Navarro and Rivers (2011) and many others...
- Dialysis Provision:
 - Ramanarayanan and Snyder (2011) examine whether dialysis centers respond to "worse than expected" ratings using a regression discontinuity design.
 - Dai (2012) Examines product differentiation between hemodialysis and (in-home) and peritoneal dialysis and the impact of the 2008 adjustment in medicare reimbursement rates.
 - Cutler, Dafny, and Ody (2012) Use mergers to estimate impact competition on quality, find little effect.

Dialysis Procedure

How Dialysis Works

In-center hemodialysis is the most common blood-cleansing therapy used by Americans with kidney failure. Patients typically are treated three times a week for three-to-four-hour sessions. Bloodlines can be attached to either a catheter or fistule.



ProPublica Graphic by Al Granberg

Data

Medicare (CMS) prepares annual report on every dialysis provider in the US we have collected data on the reports from 2004-2009.

- Location, name, and ownership information.
- Inputs: number of nurses and technicians and number of stations.
- Outputs: Patient-hours served (accounting for death, transplant, new patients and transfers).
- Quality Outcomes:
 - Hospitalization rate for septic infection.
 - Death rate at center, and expected death rate calculated with individual patient characteristics.

Production Function

We assume a Cobb-Douglas production function,

$$Y_{it} = A_{it}(q_{it})K_{it}^{\beta_k}L_{it}^{\beta_\ell},$$

where for center i in year t,

- $extbf{Y}_{it}$ is patient-years of service provided.
- K_{it} is the number of stations available in the center.
- Lit is full-time equivalent nurses and technicians on staff.
- $A(q_{it})$ is a Hicks-neutral technology shifter which depends on "quality target" for septic infection rate.

Production Function

Let,

$$A(q_{it}) = e^{\alpha_0 + \alpha_q q_{it} + \omega_{it} + \epsilon_{it}},$$

Where,

- $lacktriangleq \alpha_q$ is the impact of quality targets on production.
- ullet ω_{it} is the firm productivity which is observed by the firm at t.
- \bullet ϵ_{it} is unanticipated productivity or measurement error.

Taking logs we arrive at,

$$y_{it} = \alpha_0 + \alpha_q q_{it} + \beta_k k_{it} + \beta_\ell \ell_{it} + \omega_{it} + \epsilon_{it}$$

Endogeneity

$$y_{it} = \alpha_0 + \alpha_q q_{it} + \beta_k k_{it} + \beta_\ell \ell_{it} + \omega_{it} + \epsilon_{it}$$

- We face the usual endogeneity problem: centers observe ω_{it} when choosing inputs and quality target.
- Olley-Pakes approach: use investment as a proxy to develop a control function for productivity.
- However, we can't use investment because net investment is zero 90% of the time.
- Instead we'll use net hiring, because of license and training requirements, delay in hiring fits the industry.

Measuring Quality

$$y_{it} = \alpha_0 + \alpha_q q_{it} + \beta_k k_{it} + \beta_\ell \ell_{it} + \omega_{it} + \epsilon_{it}$$

- Quality effort is not directly observed.
- We proxy for quality effort by using the rate of hospitalization for septic infection.
- Since proxy is noisy, use rate of deaths to expected deaths as an instrument.
- Our approach gives similar results whether or not we use instruments.

The Quality Proxy

- Beyond quality effort, the infection rate is affected by patient characteristics in the center.
- While Medicare constructs "expected deaths" from individual patient charachteristics, they do not do so for infections.
- Instead we use center aggregates, z_{it}:
 - Average Age, Percent Female
 - Percent with AV Fistula
 - Average number of comorbidities
 - Duration of ESRD, Average hemoglobin levels
- We then use the residual of:

$$i_{it} = z'_{it}\delta - q_{it}$$

as our proxy for quality.

Policy Shifters

We allow firm policies to depend on observable characteristics, x_{it} that do not directly affect production.

- For-Profit Status: Non-profit firms may prefer higher quality because they are maximizing something other than profits.
- **Competition:** Centers in competitive markets may want to provide higher quality of service.

So we have the policy functions:

$$q_{it} = q(k_{it}, \ell_{it}, x_{it}, \omega_{i,t-b})$$
 $h_{it} = h(k_{it}, \ell_{it}, x_{it}, \omega_{i,t})$

Results

Start by comparing our model with simpler approaches:

- OLS: Assume choices are uncorollated with productivity (ignore endogeneity).
- Fixed Effects: Assume center productivity is fixed over time.

If quality provision is positively corrolated with productivity, we would expect that both OLS and FE estimates of α_q would be biased upwards.

Table: Production Function Estimates.

	OLS	FE	Model
Quality Effort, α_q	-0.0028	-0.0018	-0.0124
	(0.0007)	(0.0004)	(0.0042)
Capital, β_k	0.4607	0.1788	0.5134
	(0.0209)	(0.0514)	(0.0468)
Labor, eta_ℓ	0.6723	0.1855	0.2453
	(0.0149)	(0.0119)	(0.0319)

Results on Quality-Quantity Tradeoff

- Lowering quality target (raising targeted septic infection rate) by 1 percentage point can increase output by 1.2 percent.
 - Serving roughly one additional patient (a two percent increase in output for the average center) holding inputs & productivity fixed would raise center's infection rate 1.6 points.
- Same increase in output could be achieved by raising labor input 5 percent.
 - Serving one additional patient holding capital, quality, & productivity fixed would require one additional nurse (roughly a 10 percent increase in staffing).

Incentives to offer high quality

Of course, there may be non-linear effects; as a robustness check, we use the partially linear specification:

$$q_{it} = \gamma_{c(it)} + \delta_{fp(it)} + \mu(k_{it}, \ell_{it}, \hat{\omega}_{it}) + \nu_{it},$$

- $\gamma_{c(it)}$ is a dummy for whether firm faces 0,1,2, or 3 or more firms in its home market (hospital service area).
- $\delta_{fp(it)}$ is a dummy for whether firm is for-profit.
- μ is a non-parametric function of capital, labor, and productivity estimate.
- $lue{}$ Can also subsume for profit status and competition levels into μ .

Table: Partially Linear Quality Regressions.

	Ш	IV	V
For Profit	-1.5390	-1.5444	
	(0.2030)	(0.2111)	
Monopolist	0.4824		0.4725
	(0.2196)		(0.2222)
Duopolist	-0.2977		-0.2926
	(0.1843)		(0.1855)
Triopolist	-0.4678		-0.4431
	(0.2234)		(0.2224)
Nonparametric Control for:			
Productivity	Yes	Yes	Yes
Capital	Yes	Yes	Yes
Labor	Yes	Yes	Yes
For-Profit Status	No	No	Yes
Competition	No	Yes	No

Conclusion

- We find a significant quality-quantity tradeoff in the industry—firms can raise output by reducing quality.
- Firms with different profit incentives choose quality levels differently.
- Competition does not seem to play a strong role in firms' quality policies.
- We suspect these findings apply across many settings: