

Technology Entry in the Presence of Patent Thickets

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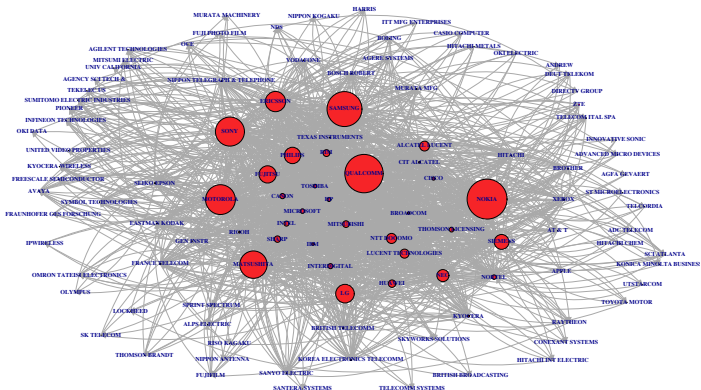
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Patent Thickets

- ▶ Shapiro (2001): "... a dense web of overlapping intellectual property rights that a company must hack its way through in order to actually commercialize new technology."



Questions

▷ Do patent thickets affect entry?

1 Are there patent thickets ?

Yes: Hall and Ziedonis (2001); Ziedonis (2004); Jaffe and Lerner (2004); Bessen and Meurer (2008); Graevenitz et al. (2013)

2 Effects on patenting, R&D investments and competition?

Patenting increases, opposition decreases, R&D unaffected (?), competition ?

3 Is there a measurable effect on entry into patenting by UK firms?

This paper

Context:

▷ Patent applications growing faster than patent offices can keep up.

▷ Concerns about effectiveness of patent examination:

Quillen et al. (2003); Quillen and Webster (2009), Lei and Wright (2009); van Pottelsberghe de la Potterie (2011)

▷ Unitary Patent Package



Contributions

- ▶ We model entry into patenting and patenting choices in discrete and complex technologies;
- ▶ We derive predictions on effects of complexity of technologies, technological opportunity and of thicket on entry;
- ▶ We test these predictions using UK data;
- ▶ We report statistically and economically significant effects on entry;
- ▶ All predictions hold in our data.



Causes of Patent Thickets

- ▶ New patentable subject matter
- ▶ Increasing complexity of some key technologies (e.g. ICT)
- ▶ Changing technological opportunity
- ▶ Changes in US legal system, resulting in frequent use of injunctions
- ▶ Strategic patenting, rise of Patent Assertion Entities (PAEs)
- ▶ Lack of resources at patent offices
- ▶ Increased trade

- ▶ Some of these forces arguably improve social welfare

▶ Details



Theory

Discrete technology

Technological opportunity raises patenting, competition reduces it (Graevenitz et al., 2013).

$$\pi_{ik}(o_i) = o_i p_k V - o_i L - o_i C_o - o_i p_k C_a - C_c(o_i) \quad .$$

where

o_i – Number of opportunities (=patents) applied for

V – Value of an opportunity

p_k – Probability of patent grant

L – Legal costs

C_o – R&D costs

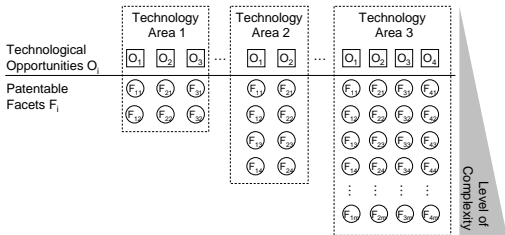
C_a – Costs of administering the patent

C_c – Costs of R&D coordination



Theory

Extension to complex technology



- ▶ In a technology area there are $\Omega = FO$ patents. Here O represents technological opportunities and F facets of these.
- ▶

$$N_k = \sum_{j=0}^N j \binom{N}{j} \left(1 - \frac{o}{O}^{(N-j)}\right) \frac{o}{O}^j, \quad p_k = \sum_{j=0}^{N_k} \frac{1}{j+1} \binom{N_k}{j} \prod_{l=0}^{N_k-j} \left(1 - \frac{f_l}{F}\right) \prod_{m=0}^j \frac{f_m}{F}$$



Theory

Complex technology

- ▶ We analyze a two stage model of entry and patenting.
- ▶ Stage two is a generalized version of Graevenitz et al. (2013):

$$\pi_{ik}(o_i, f_i) = o_i \left(V(\tilde{F}) \Delta(s_{ik}) - L(f_i p_k, s_{ik}, h_k) - C_o \left(\sum_j^{N_o} o_j \right) - f_i p_k C_a \right) - C_c(o_i) \quad .$$

where f_i, o_i – Number of facets/opportunities applied for

\tilde{F} – Total facets granted per opportunity

s_{ik} – Share of facets granted to the firm

- ▶ If the game is supermodular, doing comparative statics is simple.
- ⇒ The conditions for supermodularity are *fragmentation* of patent applications and *elasticity* of $V >$ *elasticity* of Δ .
- ▶ Extension to incumbents and entrants.



Theory

Main Results

- ▶ Greater opportunity increases entry.
- ▶ Greater complexity increases entry.
- ▶ Greater likelihood of hold-up reduces entry.
- ▶ Greater experience with R&D increases entry in new areas.

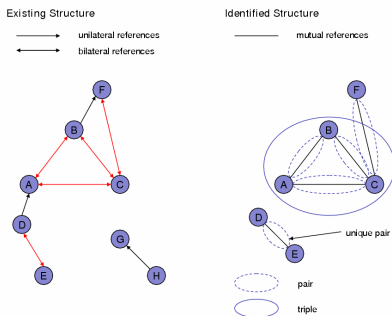


Data Sources and Sample

- ▶ PATSTAT 2010 & 2011 yielding data on UK and EPO patents until 2009.
- ▶ FAME 2005, 2009 & 2011 - covering the population of registered UK firms until 2009.
- ▶ PATSTAT and FAME are matched at firm level.
- ▶ Sample includes all UK firms with at least one patent application between 2001 and 2009.
- ▶ Additionally, we include 1% of all non-patenting UK firms.
- ▶ 29,435 firms that might enter 34 areas, yielding 998,219 observations at risk with 12,991 actual entries.

Triples: Measuring the Density of Patent Thickets

- ▶ We exploit citation from european patents to measure thicket density using a count of **triples**:



Triad census: Holland and Leinhardt (1976); Milo et al. (2002, 2004)

Three is a crowd: Grujić et al. (2012)



Advantages & Disadvantages of the Triples Measure

- ▶ It is based on the “objective” research of patent examiners.
- ▶ It captures the network aspect of patent thickets using an established measure of local network structure.
- ▶ It captures firm and time specific variation in intensity of thickets.
- ▶ The measure is a proxy measure of hold-up potential.

Critical References in Applications and Granted Patents

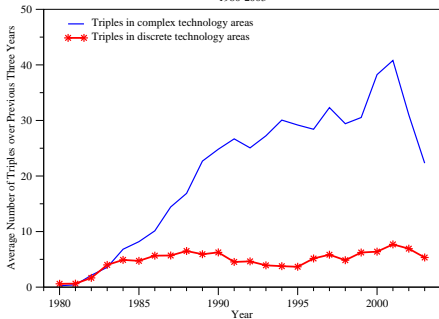
	Share with		
	any X cite	any Y cite	X or Y cite
Granted	30.7%	15.9%	37.3%
Not granted	43.0%	20.0%	49.7%



A simple test of the *triples* measure

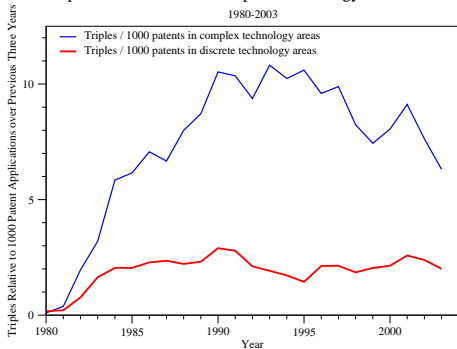
Triples in Discrete and Complex Technology Areas at EPO

1980-2003



Triples in Discrete and Complex Technology Areas at EPO

1980-2003



Variables

- ▶ Dependent variable:
 - Entry into a technology area new to the firm

- ▶ Independent variables:
 - Technological opportunity (+): log of area applications in a year, 5 year growth rate in non-patent literature references
 - Technological complexity (+): network density of citations in US patents in 10 years before potential entry
 - Thicket density (−): triples measure



Results: Empirical Models

- ▶ We estimate duration models:

How long before a firm **first** patents in sector j ?

- ▶ Duration models explain how variables of interest (normalized triples) affect probability of patenting.
- ▶ Covariates are firm characteristics (assets, age), sector characteristics (applications).
- ▶ We stratify by industrial sector.
- ▶ Different models are estimated; AFT models allow the hazard of patenting to vary with firm characteristics.
- ▶ We do not have an experiment/shock to allow identification of a causal effect.

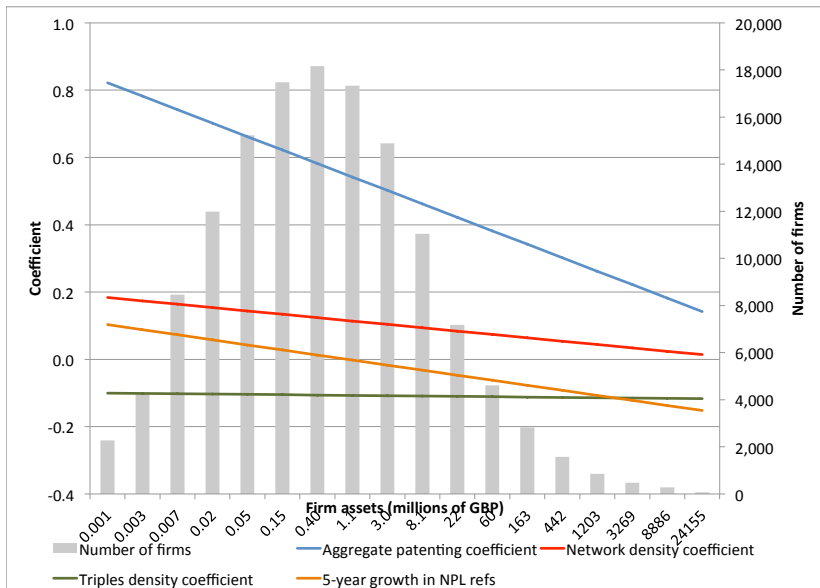


Table 4: *Cox Proportional Hazard Model*Coefficients for the hazard of entry into patenting in a TF34 Class
538,452 firm-TF34 observations with 10,665 entries (29,435 firms)

Compl. : Log (network density)	0.115*** (0.024)		0.127*** (0.023)	0.107*** (0.021)
Opp. : Log (patents in class)	0.317*** (0.025)	0.506*** (0.031)	0.545*** (0.030)	0.514*** (0.027)
Opp. : 5-year growth of non-patent refs in class	0.060*** (0.022)	0.084*** (0.022)	0.072*** (0.022)	-0.009 (0.021)
Hold-up: Log (triples density in class)		-0.138*** (0.011)	-0.139*** (0.011)	-0.101*** (0.010)
Age : Log firm age in years	1.135*** (0.104)	1.135*** (0.104)	1.136*** (0.104)	0.773*** (0.130)
Age : Log (pats applied for by firm previously)				0.836*** (0.021)
Size : Log assets	0.270*** (0.011)	0.270*** (0.011)	0.270*** (0.011)	0.142*** (0.013)
Industry dummies	stratified	stratified	stratified	stratified
Year dummies	yes	yes	yes	yes
Log likelihood	-65.96	-65.86	-65.84	-58.69
Degrees of freedom	12	12	13	14
Chi-squared	1270.6	1429.1	1517.2	3465.1

Std. errors are clustered on firm. *** (***) denote sig. at the 1% (5%) level.

Summary of Results



Conclusion

- ▶ Patent thickets in technologies such as ICT exist.
- ▶ These thickets affect entry into patenting and in some cases product market entry.
- ▶ If causes of thickets are not addressed, market structure may be affected.
- ▶ UK patenting firms are not concentrated in ICT technologies.



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Background Factors: Complexity, Opportunity, Trade

- ▶ Complexity: scientific discoveries and patents are increasingly the result of teamwork, the teams involved are getting larger, their members more specialized (Jones, 2009, 2010a,b).
- ▶ Complexity: standards in ITC involve more eligible firms, more participants and more patents.
- ▶ Technological opportunity: less opportunity intensifies patenting in complex technologies (Harhoff et al., 2012b).
- ▶ Trade: between 1990 and 2007 subsequent filings grow faster than first filings (WIPO, 2011).

Institutional changes - mainly US

- ▶ Patentable subject matter extended, e.g. software.
- ▶ Establishment of the centralized Court of Appeals for the Federal Circuit (CAFC) in 1982.
- ▶ In *eBay v MercExchange* (2006) the US Supreme Court creates a tougher test for injunctions.
 - Now PAE's go to the International Trade Commission (Chien and Lemley, 2012).
- ▶ Both USPTO and EPO have attempted to address some of their quality problems.



Strategic responses

- ▶ Patent portfolio races among semiconductor firms. (Hall and Ziedonis, 2001; Ziedonis, 2004)
- ▶ Rising litigation by PAEs, reduces market value of defendants. (Bessen et al., 2011; Tucker, 2012)
- ▶ Large firms increase patenting, medium and smaller sized firms reduce patenting (Graevenitz et al., 2013).
- ▶ Reduction in post grant opposition (Harhoff et al., 2012a).



Effects of Patent Thickets - R&D, Entry, product Markets

- ▶ Heterogeneous effects of thickets on R&D investments and new product introduction: firms in better bargaining positions tend to benefit at the expense of others.
Schankerman and Noel (2006); Cockburn et al. (2010)
- ▶ Cockburn and MacGarvie (2011) show that a 1% increase in software patents *cause* product market entry to drop by 0.8%.
- ▶ Balasubramanian and Sivadasan (2011) show that patenting for first time patenters is especially associated with growth through increased scope.



Patent quality at EPO

- ▶ Philipp (2006) notes quality of examination decreasing.
- ▶ EPO regularly cited as having higher quality of examination than USPTO or JPO.
- ▶ In 2007 EPO institutes “Raising the Bar”.
- ▶ But in 2008 EPO examiners go on strike because of concerns about patent quality.
- ▶ In 2010 the IP Federation issue a paper highlighting quality of examination concerns, critical of “Raising the Bar”.
- ▶ Last year EPO abolish an external audit committee set up in 2009.



Log-logistic “survival” model

- ▶ Accelerated failure time model, with industry (j) - specific speed up or slow down of firm (i) - specific distribution.

Survival probability:

$$S(t) = \left[1 + (\lambda_i t_i)^{1/\gamma_j} \right]^{-1} \quad \text{with } \lambda_i = \exp(-X_i' \beta) \quad (1)$$

- ▶ Hazard of entry:

$$h(t) = -\frac{d \log S(t)}{dt} = \frac{\lambda_i^{1/\gamma_j} t^{-1+1/\gamma_j}}{\gamma_j (1 + \lambda_i^{1/\gamma_j} t^{1/\gamma_j})} \quad (2)$$

$\gamma \geq 1$: the hazard monotonically decreases from $t=0$

$\gamma < 1$: the hazard first increases and then decreases

Elasticity of hazard w.r.t. regressors

$$\frac{\partial \log(h(t))}{\partial x} = \frac{-\frac{\beta}{\gamma_j}}{1 + (\lambda_i t)^{1/\gamma_j}} \quad (3)$$

- ▶ At the centre of the distribution in our data,

$$\gamma \approx 1 \text{ and } \lambda \text{ is very small}$$

- ▶ Implication: the elasticity of hazard w.r.t. x is approximately $-\beta$ for a typical firm.
- ▶ However it varies considerably across sectors.

