

# Is there a role for patents in the financing of new innovative firms?

Bronwyn H. Hall<sup>1,2,3,4,\*</sup>

<sup>1</sup>University of California, Berkeley, CA, USA. e-mail: [bhall@berkeley.edu](mailto:bhall@berkeley.edu), <sup>2</sup>National Bureau of Economic Research, Max Planck Institute of Innovation and Competition, Munich. e-mail: [bhall@berkeley.edu](mailto:bhall@berkeley.edu),

<sup>3</sup>Institute for Fiscal Studies, London. e-mail: [bhall@berkeley.edu](mailto:bhall@berkeley.edu) and <sup>4</sup>MPI, Munich. e-mail: [bhall@berkeley.edu](mailto:bhall@berkeley.edu)

\*Main author for correspondence.

## Abstract

It is argued by many that one of the benefits of the patent system is that it creates a property right to invention that enables firms to obtain financing for the development of that invention. In this paper, I review the reasons why ownership of knowledge assets might be useful in attracting finance and then survey the empirical evidence on patent ownership and its impact on the ability of firms to obtain further financing at different stages of their development, both starting up and after becoming established. Studies that attempt to separately identify the role of patent rights and the underlying quality of the associated innovation(s) will be emphasized, although these are rather rare.

**JEL classification:** G24, G32, L26, O34

## 1. Introduction

The question of whether patents are effective as inducements to innovative activity goes back to at least Fritz Machlup's and Edith Penrose's well-known comments on the patent system in the 1950s:

If national patent laws did not exist, it would be difficult to make a conclusive case for introducing them; but the fact that they do exist shifts the burden of proof and it is equally difficult to make a really conclusive case for abolishing them. (Penrose 1951)

If we did not have a patent system, it would be irresponsible, on the basis of our present knowledge of its economic consequences, to recommend instituting one. But since we have had a patent system for a long time, it would be irresponsible, on the basis of our present knowledge, to recommend abolishing it. (Machlup 1958)

It is probably safe to say that our overall assessment of the costs and benefits of the patent system today has not advanced much beyond these statements, although we have much greater knowledge about the details of its operation and the sectors in which it is more or less beneficial for innovation.<sup>1</sup>

In addition to the general argument in favor of patents as a way to incentivize innovation by allowing patent owners to exclude those who free-ride on their investments, an additional related argument is that patents are especially

1 See Hall and Harhoff (2012) for a brief survey of the evidence on the patent system-innovation relationship. Harhoff (2009) also discusses the role of patents in securing financing.

useful for new entrepreneurial firms, which have few assets and difficulty signaling their potential to investors. In this article, I survey the limited empirical evidence on the effectiveness of patents in this role, and then discuss the possible negative aspects of this use of patents.

Entrepreneurs are rarely wealthy enough to finance the investment in their ideas that would be necessary to bring them to the market. Therefore they are compelled to turn to external sources of finance, be they angel investors, venture capitalists, banks, or even private equity. Traditionally, the cost of funds for investment in a startup or other new venture could be reduced by the availability of some salvage value for the asset thus created. However, unlike the case of tangible investment, investment in new ideas and inventions does not automatically create property rights for the resulting assets in most cases. In addition, such intangible assets may be harder for investors to evaluate, especially *ex ante*. Hall (2002, 2009) has a fuller discussion of these issues.

Many have pointed out that patents, by creating property rights to the knowledge assets thus created, may be able to lower the cost of finance for investment in ideas e.g., Lemley (2000). There are at least three distinct ways that obtaining a patent (or patents) on an invention could reduce the cost of financing its development:

1. Patents can improve the expected profitability of the project, given their role in increasing the appropriability of the returns.
2. Patents, especially if granted, provide an external signal about the quality of the entrepreneur's invention(s).
3. A patent or patents on the idea or knowledge asset may increase the salvage value of an enterprise if it fails and exits. Although failure raises some question about the value of the associated patents, there is plenty of evidence on failing firms that attempt to exploit their patent portfolio when they exit a line of business (some recent examples: Ericsson, Motorola, and Nokia)

Hottenrott *et al.* (2017) provide some support to this idea as it relates to established firms. Using a sample of approximately 1000 Flemish firms, they find that the ownership of patents reduces the sensitivity of R&D investment to working capital for small and medium-sized enterprises (SMEs), but not for large ones (more than 50 employees). They also find that the citations to these patents have no impact on the relationship, which suggests that patents are important by themselves rather than as proxies for the underlying quality of the invention. However, the number of patents with significant citations is very small, so the latter finding is not very robust.

In this paper, I focus on firms for which patents might be expected to be most salient: new entrepreneurial firms in high-to-medium technology sectors. Economists and legal scholars have recently begun to look at the relationship between patenting, obtaining funding (especially venture capital [VC] funding) and subsequent firm outcomes empirically.<sup>2</sup> Studying these questions is challenging both because the data frequently has to be hand-collected, and also because the same identification problem that affects studies of patent valuation also affects these studies. That is, when a positive effect of patenting is observed, without careful control for the underlying quality of the invention, we cannot tell whether the effect is due to invention quality or the patent right itself (Hoening and Henkel 2015; Hottenrott *et al.* 2017).<sup>3</sup> I discuss this issue further after presenting the existing research.

The paper begins with a brief overview of the theory behind the use of patents or other Intellectual Property (IP) to help in financing startups. This is followed by the two main sections that review the empirical literature on the subject: (i) the role of patents in the financing and performance of technology startups; (ii) the functioning of the market that determines the salvage value of patented technology in the case of firm failure or exit from a line of business. The final section concludes with a discussion of what has been learned and some suggestions for further research.

- 2 Innovative startups use a variety of financing mechanisms, but the patent signaling literature has focused on the VC channel, probably because that is the most important external source of finance for such firms, and where asymmetry of information is most salient.
- 3 In the past, the main empirical approach that is able to distinguish the two effects is that using patent renewal data, which focuses on willingness-to-pay for the patent right (Schankerman and Pakes 1986). Unfortunately, due to the relatively low level of patent renewal fees, this approach is not able to say much about the upper tail of the value distribution. To date, there is no research using patent renewal fees specifically for the kind of firms that are studied here.

## 2. Theoretical considerations

Suppose an inventor possesses an idea with the potential to earn profits  $\pi > 0$ . However there is uncertainty about success, which is characterized as a simple probability  $\alpha$ ,  $0 < \alpha < 1$ , such that  $E[V] = \alpha\pi$ , where  $V$  is the value of the project to the potential investor. If the invention is patented before further development, the investor can retrieve a salvage value  $0 < S < \pi$  in the case of failure, by selling or enforcing the patent.<sup>4</sup> In this case,  $E[V] = \alpha\pi + (1-\alpha)S > \alpha\pi$ . So, one obvious reason that an investor might prefer a patented idea to a similar unpatented idea is the possibility of limiting losses in case of failure.

Another reason why patenting might be valuable is that it increases profitability because it makes the returns to commercialization of the idea easier to appropriate, leading to a  $\pi' = \pi + x > \pi$ . Now  $E[V] = \alpha\pi + \alpha x + (1-\alpha)S$ , which is larger than  $\alpha\pi$  for two reasons:  $\alpha x$  from increased profitability and  $(1-\alpha)S$  from the salvage value.

Now assume that the inventor/entrepreneur cannot fully inform the investor of the quality of his idea or his own quality. In this case, he may patent in order to signal quality (Spence 1973) as well as for the usual appropriability and salvage value reasons. Spence considers a market with numerous potential employees (in this case, entrepreneurs) of varying productivity who do not enter the market very often, so reputation-building is not worthwhile.<sup>5</sup> The potential employer (venture capitalist) cannot discern the quality of their projects accurately, although the entrepreneurs are better informed. He shows that in this case, if there is a signal whose acquisition cost is negatively correlated with quality or productivity, a number of equilibria may result. One of these equilibria involves high-quality types obtaining the signal, while low-quality types will find it too costly to obtain. This allows the high-quality types to “signal” their quality to the VCs and obtain financing.

Cho and Kreps (1987) show that the so-called “separating” equilibrium of this game is preferred under their intuitive criterion and the criteria of Riley (1979) and Banks and Sobel (1987). Applying this model here requires assuming that obtaining patent(s) is only feasible if the project is of a sufficiently high technical quality. Then the presence of patent filings acts as a signal to the potential investor of the technical quality of the idea. Empirically, of course, there will be many other factors that influence the investor decision, so the prediction is that among a range of startups and controlling for the project and entrepreneur characteristics, those with patent applications or grants will be more likely to obtain external finance, in particular, venture finance.

Conti *et al.* (2013) present a variation of Spence’s (1974) “productive” signaling model that is specific to the patent-financing setting. In this context, “productive” signaling refers to the idea that the patent has two functions: as a pure signal of invention quality and also to increase the returns obtained from the invention (make it appropriable). These authors assume that the cost of patenting to the entrepreneur is inversely related to invention quality and that patents confer appropriability (and are therefore productive). The potential external investor both enhances the profitability of the invention and takes a share of the profits. They show that there is a unique separating, signaling equilibrium where quality signaling increases in the number of patents, and that it is optimal for the entrepreneur to file for more patents than in the symmetric information case. In addition, they show that if inventors and investors are heterogeneous in quality, the signaling equilibrium will match them positively. That is, high-quality inventions will be funded by investors that have more to contribute to the value of the entrepreneurial firm.

## 3. Empirical evidence on patents, startup financing, and performance

This section of the paper explores the empirical evidence on three questions related to the role of patent in the success or failure of new innovative firms: (i) Does patenting help them to obtain financing?; (ii) In turn, does financing (specifically VC funds) help them to obtain patents?; and (iii) Are patents associated with better performance? Tables A1–A3 in the Appendix summarize the empirical papers I review. Table A1 contains papers that relate patenting to financing, whereas Table A2 contains papers that relate VC financing to prior patenting. One reason for including both sets of papers in this review is to highlight the undoubted empirical fact that patenting and VC funding are correlated when one looks across firms. Almost all of these papers find positive correlation in the cross-section. To

- 4 In the case where the patentee does not have the first best use for the invention, it is possible that  $S > \pi$ . This will not change the conclusion that it is better to have the option of salvage (or simple sale of the invention) than not to have it.
- 5 Note that in the VC-funding case, there is evidence that serial entrepreneurs do find it easier to obtain funding, suggesting some form of reputation building (Conti *et al.* 2013; Baum and Silverman 2004).

**Table 1.** Share of firms with patent applications during the study period

Paper	Sample	Sector	Share patenting (%)
Helmers and Rogers (2011)	All UK SMEs	Medium and high tech	6
Cao and Hsu (2011)	US VC-backed	Computer-related	7
Cao and Hsu (2011)	US VC-backed	Nonhigh technology	7
Cao and Hsu (2011)	US VC-backed	Communications/media	9
Engel and Keilbach (2004)	German VC-backed	All mfg and bus services	10
Hsu and Ziedonis (2008)	US VC-backed	Semiconductors (grants)	14
Cao and Hsu (2011)	US VC-backed	Medical/health/life science	20
Conti <i>et al.</i> (2013)	Israeli startups	Internet	20
Mann and Sager (2007)	US VC-backed	Software	25
Cao and Hsu (2011)	US VC-backed	Semiconductor	26
Cao and Hsu (2011)	US VC-backed	Biotechnology	27
Munari and Toschi (2015)	Global VC-backed	Nanotechnology	28
Hsu and Ziedonis (2008)	US VC-backed	Semiconductors (apps)	35
Conti <i>et al.</i> (2013)	Israeli startups	IT/software (grants)	38
Greenberg (2013)	Israeli VC-backed	Internet	40
Haeussler <i>et al.</i> (2014)	UK, German VC	Biotechnology	40
Conti <i>et al.</i> (2013)	Israeli startups	Cleantech (grants)	40
Wagner and Cockburn (2010)	US IPO	Internet	42
Conti <i>et al.</i> (2013)	Israeli startups	Communications (grants)	42
Greenberg (2013)	Israeli VC-backed	Software	54
Conti <i>et al.</i> (2013)	Israeli startups	Life sciences (grants)	55
Conti <i>et al.</i> (2013)	Israeli startups	Medical devices (grants)	60
Conti <i>et al.</i> (2013)	Israeli startups	Semiconductors (grants)	65
Greenberg (2013)	Israeli VC-backed	Communications	68
Greenberg (2013)	Israeli VC-backed	Semiconductors	85
Greenberg (2013)	Israeli VC-backed	Life sciences	88

unravel any causal relationship between the two requires a more nuanced examination of the data. Most authors rely on the timing of the activity: that is, whether patent filings precede funding rounds or follow them. A few attempt to use more sophisticated controls. Table A3 contains the few papers that look at subsequent firm growth and survival to financing for new or small innovative firms.

The research described in these papers covers both the United States and Europe as well as a range of technology sectors: software, semiconductors, biotechnology, nanotechnology, and the internet. The years covered are roughly 1985 to the near present, during a period when the patent system and patenting strategy in some of the sectors, notably software and the internet, evolved (Hall 2004; Hall and MacGarvie 2010; Fink *et al.* 2016). The firm samples are drawn in a variety of ways. Some consist only of patenters, but the majority includes nonpatenting firms, while some contain only VC-backed firms, and others include firms that do not obtain VC funding as well. Thus noncomparability of the results sometimes makes it difficult to draw overall conclusions.

Looking across all the studies, the most striking result at first glance is how few of the firms apply for patents, even in these relatively technology-intensive sectors.<sup>6</sup> Table 1 shows the shares of patenting firms for the studies which contained this information. When looking at the table, it is important to keep in mind that the samples on which the shares are based are very noncomparable: some are for VC-back firms only, some for all firms, some for grants, and the remainder for applications, and so forth. The table is provided merely to give a broad indication of the patenting activity in the studies considered here. With the exception of the Israeli firms studied by Greenberg (2013) and Conti *et al.* (2013), in no case do more than half the firms have at least one patent application during the period of study. Also shown in the table is the fact that firms in life science and biotechnology areas are somewhat more likely to patent than those in computer technology, especially software, as considerable survey evidence has

6 An exception is Farre-Mensa *et al.* (2017), which samples on patenters and focuses on the effect of a patent grant.

shown (Cohen *et al.* 2000; Graham *et al.* 2009; Bessen 2005; Mann 2005). Given the evidence discussed below on the positive association between patenting and firm outcomes, the relatively low patent rates are a bit surprising. Of course, there may be considerable variation in the entrepreneur's or, less often, the VC's understanding or appreciation of the patent system.<sup>7</sup>

Alternatively, it may be that the firm had no inventions for which patent protection would be appropriate. This latter argument does suggest that patents are to some extent proxying for quality in these regressions. Graham *et al.* (2009) surveyed entrepreneurs in the biotechnology and software sectors, finding that reasons for not patenting ranged from cost of obtaining and enforcing a patent and the availability of trade secret protection (especially in software) to fear of disclosing too much information publicly (in biotechnology). Slightly fewer respondents indicated that the invention was viewed as not patentable. These authors emphasize that patenting depends strongly on both the specific technology and the industry of the firm, even for technology startups.

### 3.1 Impact of patenting on obtaining finance

Although startups as a whole use a broad range of financing methods (Coleman *et al.* 2016), startups in technology-intensive sectors are more likely to use VC financing, at least in the United States and some other developed countries. Thus much of the research on the patenting-finance relationship that I survey below has focused on the VC channel. An important but still VC-related exception is Hochberg *et al.* (2018), who use the security interests recorded at the US Patent and Trademark Office to identify VC-funded firms that have secured their loans using patent assets. They find that the size of the firm's patent portfolio, but not its quality (measured by citations), predicts the likelihood that the firm has debt secured by patent(s). In addition, this type of debt is much more likely when the particular patent market (measured by technology) is more liquid and less likely if the patents appear to be very firm-specific.

Sichelman and Graham (2010) investigate the patent-financing relationship using the previously mentioned Graham *et al.* (2009) survey of startup and early stage companies in the biotechnology, medical device, and software sectors conducted in 2008. Both companies and expert investors rated financing and improving exit valuation as moderately to very important motives for obtaining patents, more so for biotechnology and medical devices. Interviews with semiconductor manufacturers reported in Ziedonis and Hall (2001) suggested that obtaining financing for startups is the main advantage they see in the patent system, rather than protecting the intangible assets of existing firms. In contrast, managers and IP professionals in this sector saw patenting by existing firms as a necessary cost induced by the threat of litigation and the need to cross-license in response.

Turning to the direct empirical evidence, both Haeussler *et al.* (2014) and Farre-Mensa *et al.* (2017) say yes, patents are helpful for obtaining funding. The former paper studies UK and German biotechnology startups and finds that not only does filing for an European Patent (EP) patent increase the probability of obtaining VC funding, but information revealed during the examination process also influence that probability. The share of X/Y references (threatening novelty) and delays in publishing the search report are negative for VC funding. Opposition to the patent by others increases the hazard of obtaining funding. The authors argue that because the presence of opposition could be both negative (because it is a threat to the patent validity) and positive (suggesting that the invention is valuable), the positive finding means that it is the underlying quality of the invention that is driving VC funding, rather than the simple existence of a patent. Similarly, Engel and Keilbach (2007) examine early stage funding of German startups and find that filing a patent at the German patent office before foundation of the firm strongly predicts later VC involvement with the startup.

Cockburn and MacGarvie use a different approach, one based on narrowly defined markets. They have data on a number of narrow software markets (e.g., fax software, ATM software, tax software, etc.), some of which were in areas where patents were not issued prior to 1995 (the date of the key software patent decisions such as *Alappat*) or 1998 (the date of the *State Street* decision on business method patents).<sup>8,9</sup> They find that in the markets characterized by having large numbers of patents, not having patents delays both VC funding and IPOs, and that this effect is stronger post-1995 (pure software) or 1998 (business methods) for firms in technologies affected by these key court decisions.

7 See Ito (2005) for one VC's thoughts on the value (or not) of patents to startups.

8 *In re Alappat* 33 F.3d 1526, 31 USPQ2d 1545 (Fed. Cir. 1995).

9 *State Street Bank and Trust Co., Inc. v. Signature Financial Group, Inc.*, 149 F.3d 1368 (Fed. Cir. 1998).

Baum and Silverman (2004) ask whether the contribution of venture capitalists is to pick winners, or to assist in developing the startup subsequent to financing it. To do this, they assemble a sample of ~200 Canadian biotechnology startups, not all of which received VC or other funding. They find that characteristics valued for funding are highly correlated with subsequent performance, suggesting that the VCs are good at choosing startups. They also find that the VCs influence the startups after funding by changing the management team once the firm has been chosen. Patent applications have a highly significant impact on the amount of money raised. However, patent grants have less impact, conditioning on applications. This finding is not uncommon—given the high effective grant rate at the USPTO (Quillen *et al.* 2003; Cotropia and Quillen 2017), the additional information from the grant may not add much, contrary to the Farre-Mensa *et al.* findings. However, it does call into question the role of the patent office in certifying the invention quality.

Conti *et al.* (2013) focus on the different startup characteristics demanded by VC and angel funders. They use startups that participated in Georgia Institute of Technology's incubator, the majority of which were IT-based. The paper is notable in that they test for and find joint endogeneity between patenting and the initial funding by friends and family, leading them to use instrumental variable estimation to estimate the patenting–funding relationship. They find that contemporaneous US patent applications strongly predict the presence and amount of VC funding, but have less impact on the amount of angel financing obtained. In contrast, angel financing depends on the initial friends and family funding amounts. This result highlights the particular nature of VC funding, which does seem to prefer startups that rely on proprietary knowledge.

The previously mentioned Conti, Thursby, and Thursby (2013) paper applied their theoretical signaling model to a sample of 787 Israeli startup firms that had an Initial Public Offering (IPO), were acquired, or failed during the 2000–2011 period. Of the 1968 investors in these firms, about 20% were venture capitalists, with the rest being private investors (37%), and other investing companies (private equity, pension, insurance, etc.). However, the VC investors were far more likely to have invested in multiple startups so they form a larger share of the total financing (there are involved in approximately half of the startups). Unlike the other papers reviewed here, Conti *et al.* estimate a simultaneous model where the number of patent grants obtained between rounds of financing is regressed on the amount of funding raised and the number of new investors, both instrumented by characteristics of the US VC market during the 3 years preceding the round. They test for endogeneity and fail to reject its presence in all but the very first round of financing. That is, patenting and the obtaining of new money/investors are simultaneously determined.<sup>10</sup> They do find that obtaining new VC investors is related to the change in patent grants between rounds, whereas obtaining new private investors is not. Thus they have evidence that the signaling function of patents is more important for obtaining VC finance than for the other types of finance.

Several of the papers condition on being a VC-financed firm. For these samples of firms, the question asked is whether larger amounts or more rounds are financed if the firm has a patent. The earliest paper using this approach is Lerner (1994, 1995), who examined VC-backed US biotechnology startups, finding a valuation elasticity of 0.5 with respect to US patent grants. Hsu and Ziedonis (2008) use a sample of VC-backed semiconductor firms and fixed effects models to examine the changes in valuation before each round of financing as a function of the firm's patent application stock. The use of fixed effects means that they control for the average quality of the startup, but not for any information about quality revealed in the course of its progress. They do find that the stock of patent applications increases valuation, especially in the early rounds and when the firm's founders have no prior IPO experience, or when the firm is not financed by a “prominent” VC. The inference is that the patents are serving as a signal of quality when other signals are not available. It is noteworthy that Hsu and Ziedonis found noisier estimates when they used patent grants, as though the grants were not adding as much information, unlike in the Farre-Mensa *et al.* (2017) sample.

- 10 It is worth noting that from an econometric panel data perspective, the regression they use is a bit peculiar, in that the left-hand side predates the right-hand side. That is, the model is that the firm chooses patents between  $t$  and  $t-1$  in response to the funding and investors received at  $t$ . Instrumenting is therefore essential, since this can only be true in an expectational sense. The choice of instruments implies that the patenting choice is identified from changes in future valuation that are correlated with the US VC climate. If the firm expects obtaining investor funds in the future to be easier, it will patent more. It might have been interesting to examine whether the reverse is true, with instruments for patenting when it is on the right-hand side.

Munari and Toschi (2015) ask whether the amount of VC funding received by nanotechnology firms in the first round is related to their patent application holdings. The answer is yes. Interestingly, VCs that specialize in nanotechnology only care about nano-patents (as indicated by the European Patent Office with a special class, Y01N)<sup>11</sup>, while generalists value patent scope as indicated by the number of associated patent classes. This suggests that generalist VCs may be focusing on inventions that have more broad-based applications of nanotechnology, as one might have expected.

Like Hsu and Ziedonis (2008) and Munari and Toschi (2015), Mann and Sager (2007) focus on venture-backed firms, this time in software. Again, they find that total investment in these firms is related to patents, this time to the number of granted patents (although the grant itself apparently does not matter, at least for the first round of financing). They also find that the number of financing rounds and the survival of the firm are positively associated with patents.

An interesting finding in Greenberg (2013) is that Israeli firms that have gone through at least two rounds of VC funding are much more likely to have patents than startups in the other papers reviewed here (see Table 1). The paper confirms that patent applications are associated with higher valuations at each round of funding, except for firms in the software sector. The elasticity of value with respect to US patenting varies across sectors, from 0.08 (insignificant) in software to 0.71 in life sciences, a result that agrees approximately with that of Lerner (1994) for the United States. As before in Conti *et al.* (2013), in the presence of patent applications, patent grants do not matter for valuation.

Using VC-backed US biotechnology startups, Hoenen *et al.* (2014) are able to show that the impact of patent filings declines after the first funding round, and that grants matter only if applications are excluded. They also find that the usual measures of patent quality (subsequent citations or family size) are not as important. A distinct feature of this paper is that they control for selection into VC funding using a comparable sample of SBIR (Small Business Innovation Research) funded startups and show that sample selection does not affect their results. The equations for the choice of VC funding and its amount are negatively correlated, but not very significantly. They do not include patent filings in the VC selection equation, and the patent grants prior to the first round are insignificant in this equation. Further exploration might be warranted, to see if filings affect the VC dummy as well as its amount.

A completely different approach to this question is taken by Hoeng and Henkel (2015), who survey a large number of venture capitalists to elicit their choices among projects with varying degrees of uncertainty, patenting, team experience, and alliances. They use conjoint analysis to determine that possession of a patent application or grant makes the project more likely to be chosen for funding, but that this likelihood is not higher when the technology quality is unknown. They interpret this result to mean that the signaling aspect of patents is unimportant compared with their role as property rights to the technology.

An important paper by Feldman (2014) reports on the results of a survey of venture capitalists and their portfolio companies. Among other questions, they were asked whether they agreed with the statement “as a venture capitalist, I consider the potential for selling patents to patent assertion entities if the companies fail.” A total of 65% disagreed with this statement, implying that the potential salvage value of the IP associated with the companies they fund does not influence their investment decisions. Of course, this leaves the 18% who agreed with the statement (17% were neutral), so at least some VCs do care about salvage value.<sup>12</sup>

A number of conclusions emerge from this collection of papers. First, it is clear that venture capitalists prefer to fund firms that have patent applications underway, even if they are not yet granted. Although informative on its own, the grant does not add a great deal in the presence of applications, largely because the applications happen earlier, and also because the grant probability is quite high, at least in the United States, which the majority of these papers studied. However, this conclusion is tempered by the fact that Farre-Mensa *et al.* (2017) found that within

- 11 Note that this code was discontinued as of 2011 and the nano patents are now classified in B82Y, which is in accordance with both CPC (US) and IPC (international) usage. See <http://www.epo.org/news-issues/issues/classification/nano-technology.html> (14 January 2019, date last accessed).
- 12 This paper, like much of the work in this area, is published in a law journal, where the standard for empirical work is somewhat different from that in economics journals. The survey was conducted by mailing VCs one survey and then asking them to distribute a slightly different survey to the companies they funded. Unfortunately, there is no information in the paper about how the sample of 200 is split between VCs and companies, or whether the VC answers are weighted by the number of companies they fund, or even whether the 200 is simply the VC sample.

patent filing firms, the grant of a patent does improve their subsequent growth as well as their access to VC funding. Second, there is evidence in a few of these papers that VC funding is more sensitive to patenting in the earlier rounds, when the degree of asymmetric information would presumably be greatest. An exception to this is [Conti \*et al.\* \(2013\)](#), whose analysis is slightly different, in that they use the reverse regression with instruments to look at the question. Third, the papers are rather inconclusive about the reasons that patents and VC funding are related: some emphasize the relationship of patents to the underlying quality of the firm's inventions, while others see the patents as pure signals. Still others emphasize the contribution of the patent grant to appropriability such as [Hoenig and Henkel \(2015\)](#), who use direct survey data to conclude that the associated proprietary right is the important thing for investors, as well as the aforementioned [Farre-Mensa \*et al.\* \(2017\)](#).

### 3.2 Impact of VC finance on patenting

A few of these papers also looked at the impact of receiving VC financing on subsequent patenting (shown in Appendix Table A2). The majority find only a weak or even negative association with VC involvement or the level of financing, controlling for prior patenting. [Engel and Keilbach \(2007\)](#) compare German VC-backed firms with a control group of non-VC-backed firms matched on industry, founding year, size, and patenting at founding time, finding that the VC-backed firms have slightly more patents than the control group on average (about one half a patent difference).

As part of their analysis of Canadian venture-backed biotechnology firms, [Baum and Silverman \(2004\)](#) looked also at the relationship between new patent applications and grants and prior VC funding, finding no relationship in the presence of past patenting. Using a very large sample of 22,000 US VC-backed firms 1976–2005, [Cao and Hsu \(2011\)](#) find a small negative impact of the first round of VC funding on patenting, controlling for patenting prior to the first round, which is highly correlated with patenting after the first round, as suggested earlier.

Using industry-year data for the United States, [Kortum and Lerner \(2000\)](#) do find that VC-funded firms patent more, controlling for industry and year. But they do not include controls for patenting prior to receiving funding in this comparison. So their results are not inconsistent with those above. Thus, as discussed in the previous section, patenting is associated with receiving VC funding, but there is little evidence that funding itself provides a further boost to patent filing. This may be as expected, since patents are generally applied for relatively early in the research and development process, and the purpose of obtaining the funding may be to facilitate development of the invention(s) thus protected. It is probably also worth noting again that patent counts are a coarse measure of inventive activity, and most of the information they convey about firms in cross-sectional, making it difficult to tease out any detailed changes in behavior over time.

### 3.3 Patenting and startup performance

A related question of interest is whether the patenting that is associated with obtaining financing has positive longer-term consequences for the startup. A few studies have examined this issue. [Farre-Mensa \*et al.\* \(2017\)](#) use only firms that have filed for their first patent and show that obtaining a grant leads to subsequent firm growth and innovation, and that delay in examination reduces these outcomes. Their paper is unusual in that they have a plausible instrument for the patent grant, which is the examiner-specific prior granting probability. This is unrelated to anything about the current invention other than possibly its technological field (which is controlled for), but clearly related to the grant probability for the patent under consideration. That is, patent examiners have idiosyncratic grant probabilities. This paper provides support for the idea that external patent office validation and the existence of a patent (as opposed to a patent application) are what matter for subsequent performance.

[Helmers and Rogers \(2011\)](#) look at a sample of UK SMEs in high- and medium-technology industries. Controlling for sample selection due to exit, they find that both 5-year growth and survival increase if the firm has applied for either a UK or EP patent. Growth increases about 26–27% per annum given a patent, which is a large number. In contrast, [Hall \*et al.\* \(2013\)](#) using a similar sample of UK firms, but one that includes all firm sizes and sectors, finds that employment growth is insignificantly related to patent ownership, although the coefficient is positive. The difference in these results highlights the fact that for SMEs, patents may serve as a more important signal of the future than they do for large firms.

[Wagner and Cockburn \(2010\)](#) focus on a sample of internet-related firms that had an IPO on NASDAQ in the 1998–2001 period. This is a period when many internet firms failed (two-thirds of their sample were delisted by



**Table 2.** Selected large patent transactions

Date	Seller	Buyer	Number of patents	Price (\$M)	Price per patent (\$1000)
May 2011	Modu	Google	21	4.9	233
June 2011	Nortel	Apple/Microsoft consortium	6000	4500	750
August 2011	Motorola Mobility	Google	20,000	12,500	625
September 2011	IBM	Google	1023	NA	NA
March 2012	IBM	Facebook	750	NA	NA
April 2012	AOL	Microsoft	925	1100	1189
July 2012	Microsoft	Facebook	650	550	846
December 2012	Kodak	Google/Facebook/Apple/ Samsung consortium	1100	525	477

2005). They find survival associated with having patents, but not with having business method patents, although there are relatively few such patents and the confidence interval is correspondingly large. The usual quality measures (citations, family size, and international applications) did not have much impact on survival, except for a suggestion that having a patent with a large number of cites appeared to increase the probability that the firm was acquired.

The limited evidence summarized here does suggest a positive association between patenting and survival/growth, although the samples vary (UK vs. United States; SME vs. startups vs. all sizes; firms with patent applications vs. all firms). In addition, only the Farre-Mensa *et al.* paper makes any claim to be a truly causal study. So there is room for further research targeted directly at the question of whether patents benefit innovative startups in any way other than via the financing channel.

#### 4. Empirical evidence on salvage value

Realizing salvage value from the patents owned by a failing or exiting enterprise requires a functioning patent market. But does one exist? A number of analysts have critiqued the fact that the secrecy with which most patent trades and licensing takes place as preventing the emergence of a robust transparent marketplace. See, for example, Lemley and Myhrvold (2007), who argue forcefully that the development of a market would be facilitated by publication of patent assignment and license terms. Interestingly, although these authors believe transparency would reduce the potential for patent hold-up, Burstein (2015) sounds a cautionary note on patent markets, suggesting that a liquid patent market could lead to more patents rather than more innovation.

A useful lens with which to view the development of a patent market is that provided by Gans and Stern (2010). These authors confront Roth's (2007) preconditions for an effective market with insights from the market for ideas or technology. They argue the following: (i) that the market for ideas is not thick because ideas are complementary to assets possibly held by others; (ii) that ideas, although nonrival in use, may be rival in value leading to inefficient bilateral bargaining and congestion; (iii) that because the user/buyer can reproduce the ideas once known, the market is not safe, as also pointed out by Anton and Yao (2002). All of these features may make a market in ideas/inventions difficult to develop. Gans and Stern go on to discuss the potential for enforceable intellectual property rights to mitigate these problems, concluding that although they may make auctions possible and the market safe, they do not help much with the complementarity problem and may undermine market thickness via enhanced opportunities for hold-up.

In spite of the potential problems in developing an efficient and well-functioning market for patents, the trend today is toward greater trading of these assets, whether via auction-based platforms such as Ocean Tomo, patent brokers, patent pools associated with standards, or simply bilateral cross-licensing. The growth of these activities is undoubtedly related to the increased importance of digital and internet-based technologies, which are complex and require interfacing with technologies developed by others. In the next section of the paper, I look at the operation of these markets for patents during the recent past, focusing (Arora and Gambardella 2010) on the cases where the patents have their origin in a firm that is going bankrupt or is exiting the particular market for which the patents are relevant. Because many patent transactions are secret or even if their existence is known, pricing is rarely reported, the picture I obtain here is necessarily only a somewhat partial and hazy one. In addition, with the important

exception of [Serrano and Ziedonis \(2018\)](#), existing research tends to identify large firm exit and patent sale rather than patent sale from failed startups.

#### 4.1 The market for patents

Several extreme examples of value realization by large exiting firms exist and have been well-publicized. I give some examples in [Table 2](#). The sellers are either bankrupt (Modu and Nortel), or exiting a particular line of business (IBM, Kodak), or simply in need of funds (Motorola Mobility). For example, Techcrunch reports that the funds from Google will go toward payment of Modu's creditors and ex-Modu employees.<sup>13</sup> The buyers in all these cases are the technology behemoths, who typically purchase these patents as defensive insurance for litigation threats. For example, the Facebook acquisition of 750 IBM patents was undertaken after Yahoo sued Facebook for infringing 10 patents. Following the patent purchase, the suit was settled with a cross-license agreement between the two firms in July 2012.<sup>14</sup>

With the exception of the Modu sale of 21 US patents, none of the seller firms listed in [Table 2](#) were startups, although they were clearly salvaging some value from their patent portfolio. I therefore turn to the few empirical papers on the market for patent licenses to see whether there is evidence that failed startups are participating in this market.

[Agrawal et al. \(2015\)](#) use data from a 2006 survey of potential licensors (creators and owners of IP assets) to assess the role of the Gans and Stern factors in causing deals to fail. They examine three stages in the negotiation: (i) identifying a buyer/seller; (ii) initiating negotiations; and (iii) reaching an agreement. They find that lack of market thickness and inability to agree the scope of IP reduce the probability of success in phase one, while various bargaining frictions are more salient for phase two. Failure to finally reach an agreement in phase three is more likely to be due to lack of market safety (defined by the authors as the ability to protect by IP) as well as regulatory problems and a lack of trust.

The evidence in this paper supports the idea that IP may help in the market for ideas, but of course is silent on the question of whether this is the optimal allocation of these assets. Because they also find that the firms have a large amount of IP that they are willing to license but do not expect to be able to, it seems that the difficulties in achieving deal success may discourage some potential transactions. The sample of firms studied by [Agarwal et al.](#) is drawn from a 2006 survey conducted by the Licensing Foundation, and is unlikely to include many startups.<sup>15</sup> Thus although this research can inform us about the functioning of the IP market, it has little to say about the success startups have in accessing the market.

[Love et al. \(2017\)](#) created a new dataset containing a large number of sales offers by more than 100 patent brokers and online platforms during the period 2012–2016.<sup>16</sup> In all, they study 2605 lots containing 39,000 patents, of which 23,900 were US patents. Approximately three-quarters of the offerings had price guidance attached, with a mean (median) price of \$210K (\$150K) per patent, somewhat lower than the values shown in [Table 2](#). Dividing the sellers into five types (individual, patent assertion entity [PAE], university, defensive aggregator, operating company), they find that two-thirds are operating companies. The most important sellers are AT&T, Xerox PARC, Panasonic, Verizon, Cypress semiconductor, Alcatel Lucent, IBM, Allied Security Trust, Hewlett-Packard, Huawei, and Intel. Although one could argue that some of these are firms exiting a particular line of business, the authors do not present any information that would allow us to identify failed startups among the sellers, although they may be there. The buyers of these patents are almost equally split between operating companies (42%) and PAEs and defensive aggregators (55%). The majority (83%) of post-purchase assertion of these patents does come from the aptly-named PAEs.

In contrast, [Oliver et al. \(2016\)](#) use similar data to report on 66 transactions across 28 companies during 2010–2015, finding that 71–78% of patent sales occur when the company underperforms the NASDAQ-100 for the two

13 <https://techcrunch.com/2011/05/20/google-spends-4-9-million-on-modu-patent-portfolio/>

14 <http://money.cnn.com/2012/07/06/technology/yahoo-facebook-patent-settle/index.htm> (14 January 2019, date last accessed).

15 The smallest firms in the sample have at least \$500,000 in revenue and R&D, as well as one licensing professional in their employment. The average firm has \$1B–10B in revenue and between 5000 and 10,000 employees.

16 Two of the authors on this paper are partners in the Richardson Oliver Law Group, which has a relationship with many buyers in the patent market. This facilitated their access to the broker data, which was obtained under nondisclosure agreements, so there are limits to what they could disclose about particular transactions.

**Table 3.** Ocean Tomo auction studies

Ocean Tomo auction studies								
Authors	Data year	Lots	Patents	Average lot size	Share sold (%)	Average lot price (US\$1000)	Sale determinants	Pricing determinants
Sneed and Johnson (2009)	Spring 2006	99	402	4.06	50	210	Smaller scope, smaller family size, younger age <i>note: no technology control</i>	Broader scope, smaller family, higher forward cites, younger age, smaller lot, individual or university seller
Lee and Lee (2010)	2007	78	145	1.86	49	308	Smaller scope, corporate seller, larger family size, large number of related bidders, smaller lot size, smaller n of related patents; <i>limited technology controls</i>	NA
Odasso <i>et al.</i> (2015)	2006	127	569	4.48	22	285	Corporate seller, higher forward cites, more assignees, technically congruent lot; <i>technology &amp; year controls</i>	Higher forward cites, more assignees, technically congruent lot. <i>if seller is NPE: higher claims, more residual life; technology &amp; year controls</i>
Odasso <i>et al.</i> (2015)	2007	172	440	2.56	44	357		
Odasso <i>et al.</i> (2015)	2008	236	352	1.49	51	303		
Odasso <i>et al.</i> (2015)	2006–2008	535	1408	2.63	42	331		

prior years. This lends support to the idea that firms at risk of failing are able to realize value from their patent portfolios, although it does not specifically focus on startups.

The study that is most relevant to the question being posed here is that by Serrano and Ziedonis (2018), which is based on ownership assignments at the USPTO. They have a sample of 285 VC-backed startups that fail between 1988 and 2008, in medical devices, semiconductors, and software. The firms had 1766 patents, of which 68% were sold within 5 years of the firm’s exit, mostly to operating companies in their sector, in contrast to the evidence in Love *et al.* This evidence suggests fairly strongly that salvage value is available from patents in these high-technology sectors, although unfortunately there is no information on its magnitude.

A closely related study is that by Ma *et al.* (2017), which examines patent sales by firms in Chapter 11. Their sample is confined to Compustat firms, which will exclude startups that fail pre-IPO. They find that 40% of patent-holding firms sell some patents during bankruptcy reorganizations, usually within the first two-quarters after bankruptcy filing. Using a number of patent-related measures, they are able to establish that firms in financial distress are more likely to sell redeployable patents and more likely to sell into thicker technology markets. In contrast, those with failed business models rather than extreme financial distress are more likely to sell patents that are close to their core technological strength. This study makes it clear that patent sale in bankruptcy is common and that these intangible assets are in many cases treated the same way as tangible assets when reorganization takes place. Unfortunately, they do not report and results by firm size or age, so it is not possible to know how these results may differ for startup firms.

For evidence on the price at which patent sales take place, I turn to the public patent auctions. There are at least three empirical studies of the best-known patent auction marketplace, Ocean Tomo: Sneed and Johnson (2009), Lee and Lee (2010), and Odasso *et al.* (2015). Ocean Tomo established the first public auction for IP rights in 2006 and held its first round of auctions through 2008. The last auction in 2009 failed to generate enough interest and the company sold this part of its business to ICAP, which then revived the auctions in 2010. However a check online reveals

that the number of lots offered in each auction recently is rather small, and few appear to be sold, especially when compared to the 3 years 2006–2008 covered by these studies.<sup>17</sup>

Table 3 summarizes the characteristics of the auctions analyzed in each study. The results are fairly consistent, but with some differences due to the choice of specification. Over the 2006–2008 period, the number of lots sold in these auctions averaged just under 50%, and the average lot price ranged from \$210K to \$357K, for a per patent price that might be about half that, on the low side when compared with the large transactions in Table 2. All of these papers focus on the determinants of patent value in the auction, and thus do not contain much information about the sellers, other than whether or not the seller is a public company, individual, or other. Both Lee and Lee (2010) and Odasso *et al.* (2015) find that sales of corporate-owned patents are more likely than those for individuals, controlling for technology and other characteristics, but neither include information on the size and the age of the seller.

Summing up, this look at the functioning of the market for IP with respect to its benefits for failed startups is rather inconclusive. There *is* a market, and a number of firms exiting particular technologies have made use of it, but there is little evidence about the nature of these firms, with the exception of a few well-known large technology firms that attract journalist coverage. Owing to the lack of transparency in parts of the licensing and sale market, the papers reviewed have relied on relatively selective datasets, so the picture is very incomplete. Additionally, it must be pointed out that there may be substantive differences between the technologies available from large established firms that are exiting a line of business and those from failed startups. That is, presumably one of the reasons for the failure of a technology-based startup may indeed be that their technology is no longer valuable to anyone else, as well as to the firm itself.

#### 4.2 The dark side of patent markets

The beneficial nature of patent markets or markets for technology presumes that the sale of patents on the “secondhand” market occurs because the technology they protect is useful to a firm other than the one currently owning the patent. In an ideal world, the role of patent markets would be to allocate technologies to those best able to make use of them profitably and efficiently, enhancing overall welfare. However, the evidence on buyers in this market suggests that these patents are being purchased for a range of reasons, most of which do not involve actually using the protected technology. Lemley *et al.* (2016) suggest that operating companies buy patents for defensive purposes (cross-licensing or counter assertion), to keep them from others who might assert them, or as a part of a merger transaction, and less often for pure licensing reasons. That is, the primary motivation is not usually acquisition of the right to use the covered technology.

In contrast, non-practicing entities (NPEs) buy patents primarily for licensing revenue, and occasionally this leads to litigation. Such sales are a nontrivial portion of the arms-length transactions involving patents. For example, 63% of the lots sold on Ocean Tomo 2006–2008 were purchased by NPEs, who presumably found them potentially valuable for licensing or perhaps for sale to others. Love *et al.* (2017) report a similar share of brokered patents (57%) going to patent assertion entities and defensive aggregators, and that most of the litigation of these patents comes from the PAEs. Cotropia *et al.* (2014) report that about half the patent cases filed in 2012 were filed by NPEs (predominantly patent-holding companies, but also including individuals, large aggregators, and failed operating companies). In Information and Communication Technologies, the share is even higher, close to 70%. Such transactions would not be problematic if the patents in question contained useful technology, well delineated, and whose boundaries were clear. But numerous scholars have argued that in many cases the patents thus traded suffer from a number of problems that make their enforcement more a matter of rent taxation than the legitimate transfer of technology that might reward its inventors.

Burstein (2015) argues that the relevant question about patent markets is not how to make them more efficient, but whether they enhance innovation or discourage it. He argues that in a world of probabilistic patents and uncertain coverage, patent markets may facilitate trolling and hold-up that is detrimental to innovation on balance.

The problematic factors fall under four interconnected headings: (i) the presence of some low-quality patents; (ii) the frequency of parallel invention, so that the information in the patent was not used by a potential infringer; (iii) bargaining threat points that lead to extraction of more than the value of the patented invention; and (iv) actual returns to inventors are rather low. I discuss each of these factors below. But before doing so, I need to caution the

17 <http://icappatentbrokerage.com/2017-summer-catalog> (14 January 2019, date last accessed).

reader that this area of research is highly contentious, largely because the various empirical studies struggle with the nontransparency of patent licensing and patent litigation. Many studies are based on survey samples whose precise sampling methodology is difficult to determine, and they often do not contain all the information (especially transaction price information or the costs of settlement outside the court) that would be necessary for a complete study of the costs and benefits of the market. In addition, in the case of patent assertion, we only see the cases that are filed, and not those that are settled before filing. Reflecting the controversial nature of the subject, empirical studies in the area are often the object of critical comments that correct apparent data errors or call into question their methodology.<sup>18</sup>

An interesting recent study by Lemley *et al.* (2017) attempts to ascertain the size of the patent assertion “iceberg” and finds that among the 30 companies that they surveyed, 70% of the 593 patent assertions against the companies did not proceed to litigation. But even this effort was hamstrung by the understandable reluctance of the authors to probe deep enough to obtain any detail on the nature of the litigated and nonlitigated assertions. In addition, the sample was largely based on prior contacts of the authors, who are patent attorneys in Silicon Valley, so it is not a random selection of firms, but one focused on firms in the ICT sector.

In this context, “low quality patents” means those likely to be invalidated or found not to be infringed if they come to trial: they typically have vague claims whose boundaries are uncertain, lack full implementation, or cover subject matter that courts have since ruled ineligible based on the patent statutes.<sup>19</sup> In their book *Patent Failure*, Bessen and Meurer (2009) provide evidence that the fuzzy boundaries of some patents, especially those in the software and business method area, can lead to litigation based on an overly broad reading of the claims in the patent. Lemley and Shapiro (2005) term these kinds of patents “probabilistic patents” in the sense that until a suit comes to trial, their validity and whether infringement has occurred are difficult to determine. The problem is that such patents can be used to extract settlements from potential infringers that are in excess of the actual contribution of the patented technology to the product after a company has sunk other investments in the product. Reitzig *et al.* (2007) present a model of this kind of behavior. In addition, there is a free-riding problem among alleged infringers, because winning the suit by invalidating the patent benefits all of them, but the cost is born by one (Harhoff *et al.* 2016, *inter alia*).

In support of the view that NPEs often assert these “probabilistic” patents, Allison *et al.* (2011) find that when suits come to trial, NPE plaintiffs win less than 10% of the time, in contrast to operating (product) companies, who win 50% of their cases, as suggested by the simplest Priest and Klein (1984) model. However Priest and Klein also show that if the defendant faces a larger loss than the plaintiff’s gain, the revealed win probability for the plaintiff will be lower. Therefore, the low win rate suggests that the fact that NPEs face lower trial costs (due to far lower discovery costs than those faced by the operating companies) means that they are willing to pursue even doubtful cases.

Independent invention refers to the situation where an entity is sued for infringement of a patent of which it was unaware, and whose technology it has developed independently of any knowledge of that in the patent. In complex technologies, especially in software, such independent solutions to individual problems encountered in development are common. It is difficult to avoid this eventuality using prior patent search in technologies like those in ICT that are not indexed in a natural way (Mulligan and Lee 2012). Cotropia and Lemley (2009) find that out of 200 infringement cases in Delaware and East District Texas, only 10% allege actual copying (which strengthens a willful infringement charge, so there is incentive so to allege).<sup>20</sup> Almost none of the 10% were in ICT and most were in pharmaceutical and chemical technologies.

- 18 For some examples, see Cotropia *et al.* (2014), critiqued by Bessen (2014), Bessen and Meurer (2014), critiqued by Schwartz and Kesan (2014), and Lemley and Shapiro (2007a), followed by Golden (2007) and Lemley and Shapiro (2007b).
- 19 The key court decision is the U.S. Supreme Court Decision in *Alice Corp. vs. CLS Bank International* (2014), although there are several others that influence the interpretation of the section 101 of the patent statute.
- 20 In the United States, some also claim that inventors are discouraged from reading patents, especially in ICT technologies, because of the danger of a willful infringement charge in case of litigation, which can carry a threefold increase in damages. The standard for a finding of willful infringement has been a controversial area in the US courts [*In re Seagate Tech. LLC*, 497 F.3d 1360, 1371 (Fed. Cir. 2007) (*en banc*); *Halo Electronics, Inc. v. Pulse Electronics, Inc.*, 136 S. Ct. 1923 (2016)]. The American Inventors Act of 2012 codified the 2007 Federal Circuit decision, so that it is now somewhat more difficult to prove willful infringement.

Patent markets could encourage innovation by transferring litigation risk from inventors to those more able to bear the risk. For this to work effectively there should be sufficient returns to inventors via this channel. We have very limited evidence on this question. *Bessen et al. (2011)* argue that the returns to inventors are small, based on examination of the accounts of 14 NPEs that are public and therefore report their accounts to the Securities and Exchange Commission. However, it is difficult to know how to interpret their numbers: during the 2000–2010 period, these 14 firms paid out \$1.7 billion in noncapital investment. This is much less than the stock market losses of \$88 billion (as measured by an event study) that were experienced by those they sued. However, it is much more than the net income earned by these NPEs, which was \$258 million. *Chien (2014)* reports that only 9 of the 223 technology startups she surveyed had monetized their patents via licensing or sale, which suggests somewhat limited participation in this market by startups.

*Haber and Werfel (2016)* conducted a small survey of inventors and entrepreneurs in order to ascertain preferences for the enforcement of patents: in-house or via sale to a PAE. The thought experiment concerned a patent on a product improvement that was valued at \$1 million. The participants were asked to choose between (i) a certain return of \$100,000 via sale and (ii) various scenarios involving unlimited lawyer time or contingent fee litigation. At these prices, about half of both groups preferred to sell to the PAE rather than paying a lawyer and bearing the risk. However, inventors clearly preferred the contingent fee option, whereas entrepreneurs were indifferent. Although this was only a thought experiment with limited data, it gives some idea of the relatively low return that some inventors require to avoid litigation risk.

Survey and interview evidence of several kinds, as well as a more aggregate study by *Kiebzak et al. (2016)* support *Burstein's (2005)* view that a more liquid patent market might not be good for innovation, especially for that by new entrepreneurial firms. *Feldman (2014)* reports several findings on this question from their survey of VCs: (i) roughly one in three VC-backed startup companies have received demands, higher if they are in the ICT sector; (ii) two-thirds of these companies report that all or most of the demands come from PAEs; (iii) 58% of these startup companies report that the patent demands had a significant impact; (iv) 100% of VCs might refrain from investing if a company faced an existing patent demand. Although it is possible that all these demands were legitimate in the sense that the asserted patents read on the technology, interviews, anecdotal evidence, the experience of VCs, and the fact that the vast majority were in the ICT sector make that unlikely. There is no doubt that the majority of the VCs and companies view the rise of PAEs as negative for their innovative activity.

*Chien (2014)* surveys 223 technology company startups of which 79 had experienced at least one patent assertion and confirms these views, as well as highlighting the diversity of the responses to a demand. In her sample, the response ranges from doing nothing (22%), shutting down a line of business (9%), settling (18%), fighting in or out of court (35%), or other (16%). She also found significant impacts on the company's operations for about half of those companies with revenues less \$100 million. Impacts included distraction from core business, financial impact, delay in hiring or milestones, product changes, and changes in business product lines.

So are patent markets beneficial for innovation? As *Haber and Werfel (2016)* say in their conclusions:

Some studies claim that PAEs extract rents via nuisance lawsuits, thereby placing a direct tax on innovation. An alternative hypothesis is that PAEs are financial intermediaries that facilitate innovation. These hypotheses are not mutually exclusive.

Based on the evidence reported here, I would agree that both views have merit, but the balance varies across firm size and technology. For firms in the chemicals sector and for larger firms, there may be some benefits in being able to monetize patents that are no longer useful in their core business. However, for innovative startups, patent markets may not create much salvage value that benefits the startup in financing, and may instead impose enough costs that innovation in this form is discouraged. The previous statement appears to be especially true in software and business methods, broadly defined.

## 5. Conclusions

This brief survey has shown the following: in most technology-intensive sectors, patent applications (granted or not) are associated with a number of good outcomes: they help with obtaining VC funding, they increase the amount of funding thus obtained, and they are positively associated with future growth and survival. The paper that came closest to estimating a causal relationship was *Farre-Mensa et al. (2017)*, but that was for grants conditional on having

an application, although some papers, such as Engel and Keilbach (2007) use control samples, or rely on timing (lags) for identification.

However, in most cases it was also true that fewer than half the firms in the relevant sample had any patent applications (with the exception of those studies that conditioned on having patents). So the question of whether these patents are simply a proxy for the quality of the underlying firm and its technology, or whether they have value arising from the patent right, becomes important. That is, do the results surveyed suggest that other firms could improve their prospects by applying for patents, or would this be a wasteful activity because their underlying technology is simply not as good as that of the firms that have patent applications? One way to approach this question would be to choose a sample of startups in technology-based sectors and examine their inventions more closely, not identifying inventions by the fact that a patent was applied for. This would require more of a case study approach, but one that built up a reasonably sized sample of startups with inventions, only some of which were patented.

The second set of findings in the paper concern the functioning of the patent market that would enable technology startups to retrieve value from their patents on exit, an essential ingredient if patents are to be used to secure technology assets for financing. Such markets definitely exist, in several forms, but it is clear that they are plagued by the problems identified by Gans and Stern (2010), among others. Many lots remain unsold, and it seems doubtful that some of the largest transactions are actually technology transfer, rather than defensive maneuvers related to litigation. In addition, the purchasers on some (but definitely not all) of the markets appear to be dominated by NPEs, whose primary purpose is enforcing the patents against operating companies. Although specializing in enforcement is a legitimate activity, some would question whether it really advances innovation in complex technologies.

The mixed set of conclusions here are typical of most studies of the effectiveness or usefulness of patents, which arises largely from the heterogeneity of technologies and firm strategies. To push our understanding further, several approaches would be useful: (i) exploring more thoroughly the use of patents in obtaining financing beyond the VC channel, especially in countries that use more bank-based forms of finance; (ii) revisiting the salience of the salvage value of patents to VCs, using the information about the actual value realized at exit and the probability of exit; (iii) focusing on sector-level analysis, as this is one of the main sources of heterogeneity; (iv) as mentioned above, sampling on inventions rather than patents, although this is a very tall order; (v) looking for natural experiments in patent applications (as opposed to the grants used in Farre-Mensa *et al.*)—one possibility might be the changes in subject matter eligibility for business methods and software following the Alice decision (and other earlier decisions) by the US Supreme Court.<sup>21</sup>

## Acknowledgments

The current version of the paper has benefitted from comments by the Editor (Franco Malerba) and two anonymous referees.

## References

- Agrawal, A., I. Cockburn and L. Zhang. (2015), 'Deals not done: sources of failure in the market for ideas,' *Strategic Management Journal*, 36(7), 976–986.
- Allison, J. R., M. A. Lemley and J. Walker. (2011), 'Patent quality and settlement among repeat patent litigants,' *Georgetown Law Journal*, 99, 677–712.
- Anton, J. J. and D. A. Yao. (2002), 'The sale of ideas: strategic disclosure, property rights, and contracting,' *Review of Economic Studies*, 67(4), 585–607.
- Arora, A. and A. Gambardella. (2010), 'The market for technology,' in B. H. Hall and N. Rosenberg (eds), *Handbook of the Economics of Innovation*. Elsevier: Amsterdam and New York, pp. 642–674.
- Banks, J. S. and J. Sobel. (1987), 'Equilibrium selection in signaling games,' *Econometrica*, 55(3), 647–661.
- Baum, J. A. C. and B. Silverman. (2004), 'Picking winners or building them? Alliance, intellectual, and human capital as selection criteria in venture financing and performance of biotechnology startups,' *Journal of Business Venturing*, 19(3), 411–436.
- Bessen, J. E. (2005), *A Comment on "Do Patents Facilitate Financing in the Software Industry?"* Boston University School of Law and Research on Innovation: Boston, MA, p. 8.
- Bessen, J. E. (2014), 'ALL the facts: PAEs are suing many more companies,' <https://patentlyo.com/patent/2014/01/facts-suing-companies.html>

21 *In re Alice Corporation Pty. Ltd. v. CLS Bank International* 573 U.S. \_\_\_, 134 S. Ct. 2347 (2014).

- Bessen, J. E., J. Ford and M. J. Meurer. (2011), 'The private and social costs of patent trolls,' *Regulation*, 34(4), 26–35.
- Bessen, J. E. and M. J. Meurer. (2009), *Patent Failure: How Judges, Bureaucrats, and Lawyers Put Innovators at Risk*. Princeton University Press: Princeton, NJ.
- Bessen, J. E. and M. J. Meurer. (2014), 'The direct costs from NPE disputes,' *Cornell Law Review*, 99(2), 387–424.
- Burstein, M. J. (2015), 'Patent markets: a framework for evaluation,' *Arizona State Law Journal*, 47, 507–541.
- Cao, J. and P.-H. Hsu. (2011), 'The informational role of patents in venture capital financing,' SSRN, <https://ssrn.com/abstract=1678809>
- Chien, C. V. (2014), 'Startups and patent trolls,' *Stanford Technology Law Review* 17, 461. Santa Clara Univ. Legal Studies Research Paper No. 09–12. SSRN.
- Cho, I.-K. and D. M. Kreps. (1987), 'Signaling games and stable equilibria,' *The Quarterly Journal of Economics*, 102(2), 179–221.
- Cockburn, I. M. and M. MacGarvie. (2009), 'Patents, thickets, and the financing of early-stage firms: evidence from the software industry,' *Journal of Economics and Management Strategy*, 18(3), 729–773.
- Cohen, W. M., R. R. Nelson and J. P. Walsh. (2000), Protecting their intellectual assets: appropriability conditions and why firms patent or not? *NBER Working Paper No. 7552*, Cambridge, MA.
- Coleman, S., C. Cotei and J. Farhat. (2016), 'The debt-equity financing decisions of U.S. startup firms,' *Journal of Economics and Finance*, 40(1), 105–126.
- Conti, A., M. Thursby and F. T. Rothaermel. (2013), 'Show me the right stuff: signals for high-tech startups,' *Journal of Economics & Management Strategy*, 22(2), 341–364.
- Conti, A., J. Thursby and M. Thursby. (2013), 'Patents as Signals for Startup Financing,' *The Journal of Industrial Economics*, 61(3), 592–622.
- Cotropia, C. A., J. P. Kesan and D. L. Schwartz. (2014), 'Unpacking patent assertion entities (PAEs),' *Minnesota Law Review*, 99(2), 649–703.
- Cotropia, C. A. and M. A. Lemley. (2009), 'Copying in patent law,' *North Carolina Law Review*, 87(5), 1421–1466.
- Cotropia, C. A. and C. D. Quillen, Jr. (2017), 'Continuing patent applications and performance of the U.S. Patent and Trademark Office as of FY 2016,' *Richmond School of Law: Intellectual Property Institute Research Paper No. 2017–01*.
- Engel, D. and M. Keilbach. (2007), 'Firm-level implications of early stage venture capital investment—an empirical investigation,' *Journal of Empirical Finance*, 14(2), 150–167.
- Farre-Mensa, J., D. Hegde and A. Ljungqvist. (2017), 'What Is a Patent Worth? Evidence from the U.S. Patent 'Lottery',' *NBER Working Paper Series, No. 23268*.
- Feldman, R. (2014), 'Patent demands & startup companies: the view from the venture capital community,' *Yale Journal of Law and Technology*, 16(137), 236–284.
- Fink, C., M. Khan and H. Zhou. (2016), 'Exploring the worldwide patent surge,' *Economics of Innovation and New Technology*, 25(2), 114–142.
- Gans, J. S. and S. Stern. (2010), 'Is there a market for ideas?,' *Industrial and Corporate Change*, 19(3), 805–837.
- Golden, J. M. (2007), 'Patent trolls' and patent remedies,' *Texas Law Review*, 85(7), 2111–2161.
- Graham, S. J. H., R. P. Merges, P. Samuelson and T. Sichelman. (2009), 'High technology entrepreneurs and the patent system: results of the 2008 Berkeley patent survey,' *Berkeley Technology Law Journal*, 24(4), 1255–1328.
- Greenberg, G. (2013), 'Small firms, big patents? Estimating patent value using data on Israeli start-ups' financing rounds,' *European Management Review*, 10(4), 183–196.
- Guzman, J. and S. Stern. (2017), "Nowcasting and placecasting entrepreneurial quality and performance," in J. Haltiwanger, E. Hurst, J. Miranda and A. Schoar (eds), *Measuring Entrepreneurial Businesses: Current Knowledge and Challenges*. NBER Conference volume, Chicago University Press.
- Haber, S. H. and S. H. Werfel. (2016), 'Patent trolls as financial intermediaries? Experimental evidence,' *Economics Letters*, 149, 64–66.
- Haeussler, C., D. Harhoff and E. Mueller. (2014), 'How patenting informs VC investors—the case of biotechnology,' *Research Policy*, 43, 1236–1298.
- Hall, B. H. (2002), 'The financing of research and development,' *Oxford Review of Economic Policy*, 18(1), 35–51.
- Hall, B. H. (2004), 'Exploring the patent explosion,' *Journal of Technology Transfer*, 30(1–2), 35–48.
- Hall, B. H. (2009), 'The financing of innovation,' *European Investment Bank Papers*, 14(2), 1–23. Reprinted. (2010) in the *Review of Economics and Institutions* 1(1).
- Hall, B. H. and D. Harhoff. (2012), 'Recent research on the economics of patents,' *Annual Review of Economics*, 4(1), 541–565.
- Hall, B. H., C. Helmers, M. Rogers and V. Sena. (2013), 'The importance (or not) of patents to UK firms,' *Oxford Economic Papers*, 65(3), 603–629.
- Hall, B. H. and M. MacGarvie. (2010), 'The private value of software patents,' *Research Policy*, 39(7), 994–1009.
- Harhoff, D. (2009), 'The role of patents and licenses in securing external finance for innovation,' *European Investment Bank Papers*, 14(2), 74–97.



- Harhoff, D., G. von Graevenitz and S. Wagner. (2016), 'Conflict resolution, public goods, and patent thickets,' *Management Science*, **62**(3), 704–721.
- Helmers, C. and M. Rogers. (2011), 'Does patenting help high-tech start-ups?,' *Research Policy*, **40**(7), 1016–1027.
- Hochberg, Y. V., C. J. Serrano and R. H. Ziedonis. (2018), 'Patent collateral, investor commitment, and the market for venture lending,' *Journal of Financial Economics*, **130**(1), 74–94.
- Hoenen, S., C. Kolympiris, W. Schoenmakers and N. Kalaitzandonakes. (2014), 'The diminishing signaling value of patents between early rounds of venture capital financing,' *Research Policy*, **43**(6), 956–989.
- Hoening, D. and J. Henkel. (2015), 'Quality signals? The role of patents, alliances, and team experience in venture capital financing,' *Research Policy*, **44**(5), 1049–1064.
- Hottenrott, H., B. H. Hall and D. Czarnitzki. (2017), 'Patents as Quality Signals? The Implications for Financing Constraints on R&D,' *Economics of Innovation and New Technology*, **25**(3), 197–217.
- Hsu, D. H. and R. H. Ziedonis. (2013), 'Resources as dual sources of advantage: implications for valuing entrepreneurial-firm patents,' *Strategic Management Journal*, **34**(7), 761–781.
- Ito, J. (2005), 'One venture capitalist's view on software patents,' *Blog Entry*, 8 July, [http://joi.ito.com/archives/2005/07/08/one\\_venture\\_capitalists\\_view\\_on\\_software\\_patents.html](http://joi.ito.com/archives/2005/07/08/one_venture_capitalists_view_on_software_patents.html) (14 January 2019, date last accessed).
- Kiebzak, S., G. Rafert and C. Tucker. (2016), 'The effect of patent litigation and patent assertion entities on entrepreneurial activity,' *Research Policy*, **45**(1), 218–231.
- Kortum, S. and J. Lerner. (2000), 'Assessing the contribution of venture capital to innovation,' *RAND Journal of Economics*, **31**(4), 674–692.
- Lee, Y.-G. and J.-H. Lee. (2010), 'Different characteristics between auctioned and non-auctioned patents,' *Scientometrics*, **82**(1), 135–148.
- Lemley, M. A. (2000), 'Reconceiving patents in the age of venture capital,' *Journal of Small and Emerging Business Law*, **4**, 137–148.
- Lemley, M. A. and N. Myhrvold. (2007), 'How to make a patent market,' *Hofstra Law Review*, **36**, 257–259.
- Lemley, M. A., E. Oliver, K. Richardson, J. Yoon and M. Costa. (2016), 'Patent purchases and litigation outcomes,' *Patently-O Patent Law Journal*, **15**.
- Lemley, M. A., K. Richardson and E. Oliver. (2017), 'The patent enforcement iceberg,' *Stanford Public Law Working Paper*, [https://papers.ssrn.com/sol3/papers.cfm?abstract\\_id=3087573](https://papers.ssrn.com/sol3/papers.cfm?abstract_id=3087573)
- Lemley, M. A. and C. Shapiro. (2005), 'Probabilistic patents,' *Journal of Economic Perspectives*, **19**(2), 75–98.
- Lemley, M. A. and C. Shapiro. (2007a), 'Patent holdup and royalty stacking,' *Texas Law Review*, **85**(7), 1991–2049.
- Lemley, M. A. and C. Shapiro. (2007b), 'Reply: patent holdup and royalty stacking,' *Texas Law Review*, **85**,
- Lerner, J. (1994), 'Venture Capitalists and the Decision to Go Public,' *Journal of Financial Economics*, **35**(3), 293–316.
- Lerner, J. (1995), 'Venture Capitalists and the Oversight of Privately-Held Firms,' *Journal of Finance*, **50**(1), 301–318.
- Love, B. J., K. Richardson, E. Oliver and M. Costa. (2017), 'An empirical look at the "Brokered" market for patents,' [https://papers.ssrn.com/sol3/papers.cfm?abstract\\_id=3056444](https://papers.ssrn.com/sol3/papers.cfm?abstract_id=3056444)
- Ma, S., J. T. Tong and W. Wang. (2017), 'Selling innovation in bankruptcy,' *Yale, Duke, and Queens Universities: Working paper*, [https://papers.ssrn.com/sol3/papers.cfm?abstract\\_id=2903003](https://papers.ssrn.com/sol3/papers.cfm?abstract_id=2903003)
- Machlup, F. (1958), *An economic review of the patent system*, Study No.15 of Committee on Judiciary, Subcommittee on Patents, Trademarks, and Copyrights, 85th U. S. Congress, 2d Session.
- Mann, R. J. (2005), 'Do patents facilitate financing in the software industry?,' *Texas Law Review*, **83**, 961–1030.
- Mann, R. J. and T. W. Sager. (2007), 'Patents, venture capital, and software startups,' *Research Policy*, **36**(2), 193–208.
- Mulligan, C. and T. B. Lee. (2012), 'Scaling the patent system,' *NYU Annual Survey of American Law*, **68**, 289–318.
- Munari, F. and L. Toschi. (2015), 'Do patents affect VC financing? Empirical evidence from the nanotechnology sector,' *International Entrepreneurship and Management Journal*, **11**(3), 623–644.
- Odasso, C., G. Scellato and E. Ughetto. (2015), 'Selling patents at auction: an empirical analysis of patent value,' *Industrial and Corporate Change*, **24**(2), 417–438.
- Oliver, E., K. Richardson and F. Johanssen. (2016), "When do operating companies sell their patents?" IPWatchdog, (16 August 2016, date last accessed).
- Penrose, E. (1951), *The Economics of the International Patent System*. John Hopkins University Press: Baltimore.
- Priest, G. L. and B. Klein. (1984), 'The selection of disputes for litigation,' *Journal of Legal Studies*, **13**(1), 1–55.
- Quillen, J. C. D., O. H. Webster and R. Eichmann. (2003), 'Continuing patent applications and performance of the U.S. patent and trademark office—extended,' *Federal Circuit Bar Journal*, **12**(1), 35–55.
- Reitzig, M., J. Henkel and C. Heath. (2007), 'On sharks, trolls and their patent prey: unrealistic damage awards and firms' strategies of "being infringed",' *Research Policy*, **36**(1), 134–154.
- Riley, J. (1979), 'Informational equilibrium,' *Econometrica*, **47**(2), 331–359.
- Roth, A. E. (2007), 'The art of designing markets,' *Harvard Business Review*, **118**–126.

- Schankerman, M. and A. Pakes. (1986), 'Estimates of the value of patent rights in European countries during the post-1950 period,' *Economic Journal*, 96(384), 1052–1076.
- Schwartz, D. L. and J. P. Kesan. (2014), 'Analyzing the role of NPEs in the patent system,' *Cornell Law Review*, 99(2), 425–456.
- Serrano, C. J. and R. H. Ziedonis. (2018), "How redeployable are patent assets? Evidence from failed startups," *Universitat Pompeu Fabra and Boston University: Working paper*.
- Sichelman, T. and S. J. H. Graham. (2010), 'Patenting by entrepreneurs: an empirical study,' *Michigan Telecommunications Technology Law Review*, 17(1), 111–180.
- Sneed, K. A. and D. K. N. Johnson. (2009), 'Selling ideas: the determinants of patent value in an auction environment,' *R&D Management*, 39(1), 87–94.
- Spence, M. (1973), 'Job market signaling,' *Quarterly Journal of Economics*, 87(3), 355–374.
- Spence, M. (1974), 'Competitive and optimal responses to signals: an analysis of efficiency and distribution,' *Journal of Economic Theory*, 7(3), 296–332.
- U.S. Supreme Court Decision. (2014), *Alice Corporation Pty. Ltd vs CLS Bank International et al.* [https://www.supremecourt.gov/opinions/13pdf/13-298\\_7lh8.pdf](https://www.supremecourt.gov/opinions/13pdf/13-298_7lh8.pdf)
- Wagner, S. and I. Cockburn. (2010), 'Patents and the survival of Internet-related IPOs,' *Research Policy*, 39(2), 214–228.
- Ziedonis, R. H. and B. H. Hall. (2001), 'The effects of strengthening patent rights on firms engaged in cumulative innovation,' in G. Libecap (ed), *Entrepreneurial Inputs and Outcomes, Volume 13: New Studies of Entrepreneurship in the United States*. Elsevier Science: Amsterdam, pp. 133–188.

Appendix

Table A1. Literature on the impact of patents on VC funding

Author	Date	Title	Country	Industry	Years	Sample	Dep var	Patent var(s)	Results
Baum and Silverman	2004	Picking winners or building them? Alliance, intellectual, and human capital as selection criteria in venture financing and performance of biotechnology startups	Canada	Biotech	1991–2000	204 startups/471 incumbents	Pre-IPO funding; sales; rnd, empty growth; US patent apps & grants; survival	US patent apps & grants by year, plus length of time since last patent (appears to be misspecified)	Do VCs pick winners or build them? Characteristics for funding highly correlated with subsequent performance. Good at picking, but then change migt. Patent apps have a highly significant impact on money raised; grants less so in presence of apps Using IV with industry instruments, D(pat) positive for IPO, amt VC investment, negative for bankruptcy & acquisition, patent counts don't matter. Attempt to differentiate between certification and quality is doubtful.
Cao and Hsu	2011	The informational role of patents in venture financing	United States	All	1976–2005	22,000 or 10,000 VC-backed startups	D(IPO, bankruptcy, acquired), VC funding, rounds	D (US pat app), N (US pat apps)	Using IV with industry instruments, D(pat) positive for IPO, amt VC investment, negative for bankruptcy & acquisition, patent counts don't matter. Attempt to differentiate between certification and quality is doubtful.
Cockburn and MacGarvie	2009	Patents, thickets, and the financing of early stage firms: Evidence from the software industry	United States	Software	1990–2004	Software markets; software firms from CorpTech	VC funding; IPO	Granted patents in the market; interact with 1995 regime change	Narrow software markets. In thickets markets, lack of patents delays VC funding and IPOs; more after 1995 and 1998
Conti, Thursby, and Rothaermel	2013	Show me the right stuff: Signals for High-tech startups	Georgia, United States	All—44% software, only 9% biopharma	1998–2008	117 startups in Georgia Tech incubator	D(VC), VC funds, D(angel), angel funds	US patent apps in year	Patents strongly predict presence and amount of VC funding contemporaneously, but no impact on angel funding

(continued)

Table A1. Continued

Author	Date	Title	Country	Industry	Years	Sample	Dep var	Patent var(s)	Results
Conti, J. Thursby, and M. Thursby	2013	Patents as signals for startup financing	Israel	All high-tech	1994–2011	787 VC-financed startups	Change in granted patents	# new investors; VC funding in round	Instruments are US VC deal count and amount, growth in US VC deals (corr with size of Israeli VC investment). First round patent not influenced by funding, but later rounds are.
Engel and Keilbach	2004	Firm level implications of early stage VC investment—An empirical investigation	Germany	All mfg + prt + bus services	1995–1998	142 VC-backed firms; 21,375 non-VC-backed firms	Emp growth, D(early stage VC)	German patent apps before foundation	Patent filing before foundation date strongly predicts VC involvement later, but VC involvement is only weakly associated with further patenting
Farre-Mensa, Hegde, and Ljungqvist	2016	The bright side of patents	United States	All	2001–2014	1st time for-profit new US patenters, no patents 1990–2000	Subsequent VC funding	D (pat grant); #follow-on pats (# granted); exam delay	Conditional on first patent app; uses examiner assignment instrument; Patents increase prob of subsequent VC rounds. Delays in examination reduce this benefit; <10% have VC funding
Greenberg	2013	Small Firms, Big Patents? Estimating patent value using data on Israeli financing rounds	Israel	Technology-based	1987–2005	317 tech startups with VC funding	Log valuation at the VC round	US patent granted apps	Age and funding year-sector dummies. Elasticity of value to patent apps is 0.46 for non-software (higher for life sciences), nothing for software and for grants, except for very young firms
Haeussler, Harhoff, and Mueller	2014	How patenting informs VC investors—The case of biotechnology	UK; Germany	Biotech	2006	All UK/German biotechs that want VC financing	Obtaining VC finance	EP pat app stock; share X/Y refs, cites by large tech; share opp.	Filing related positively to VC financing, as is examination process; about 40% have pat

(continued)

**Table A1. Continued**

Author	Date	Title	Country	Industry	Years	Sample	Dep var	Patent var(s)	Results
Hochberg, Serrano, and Ziedonis	2018	Patent collateral, investor commitment, and the market for venture lending	United States	Semiconductors, software, medical devices	1987–2008	VC-backed startups 1987–1999	D (startup receives loan financing)	Patent market liquidity measure	apps (more if VC-backed) Lenders continue to finance firms that have credible VC commitment; patents used as security for loans
Hoenen <i>et al.</i>	2014	The diminishing signaling value of patents between early rounds of VC financing	United States	Biotech	2001–2011	VC-backed firms and SBIR funded firms	Log of investment in the round	US pat apps and grants by round	Patent apps more important for first round than second; grants seem to matter for second, and when apps excluded. Heckman correction for funding does not affect results. Quality(cites) not as important.
Hoening and Henkel	2015	Quality signals? The role of patents, alliances, and team experience in VC funding	United States; Germany	Biotech; cleantech; ICT	2011	518 potential VCs (incl assoc.) resulting in 187 obs	Choice of firm to fund	Patent app or grant	Conjoint analysis based on survey of VCs hypothetical choices. Patent app or grant helps, but not more when tech quality unknown—rejects the signaling idea.
Hsu and Ziedonis	2013	Resources as dual sources of advantage: implications for valuing entrepreneurial-firm patents	United States	Semiconductors	1975–2005 (founding)	VC only semiconductor firms	VC investor quality; pre-money value; underpricing at IPO	Pat app stock; interacted with early round and no prior IPO exp	Focus on signaling aspect of patents pre-IPO and IPO; fixed effects in valuation model; evidence that patents are worth more if less info; about 35% have patent apps; 14% have granted patents
Lerner	1994	The importance of patent scope: an empirical analysis	United States	Biotech	1973–1992	173 VC-backed firms	Valuation of firm in venture financing	Patent grants at time of financing round	Elasticity about 0.5. Doubling patent grants yields 50% increase in funding; increases in

(continued)

Table A1. Continued

Author	Date	Title	Country	Industry	Years	Sample	Dep var	Patent var(s)	Results
Mann and Sager	2007	Patents, VC, and software startups	United States	Software	1997–1999 (first round)	VC-only software firms	Rounds, exit, total inv, survival	Granted patents (number & dummies)	scope similar impact; pooled cross-section Only one in four VC-backed software acquired patents; size of portfolio does not matter; issue before first round does not matter VC specialists care about nano-patents but not other patents, VC generalists care about patent scope (# classes) but not patents
Munari and Toschi	2015	Do patents affect VC financing? Empirical evidence from the nanotechnology sector	Global	Nanotechnology	1985–2006	VC-financed nano firms	VC financing at 1st round	EP pat apps at first round; all & nano (core)	

**Table A2.** Literature on the impact of VC funding on patenting

Author	Date	Title	Country	Industry	Years	Sample	Dep var	Indep var	Results
Baum and Silverman	2004	Picking winners or building them? Alliance, intellectual, and human capital as selection criteria in venture financing and performance of biotechnology startups	Canada	Biotech	1991–2000	204 startups/471 incumbents	US patent apps and grants	Canadian IRAP seed capital; pre-IPO financing; time since funding	Canadian seed capital highly correlated with patents; firms with patents receive more pre-IPO funding, but pre-IPO funding not associated with patent apps or grants in the presence of time since patent
Cao and Hsu	2011	The informational role of patents in venture financing	United States	All	1976–2005	22,000 or 10,000 VC-backed startups	Increase in patent counts after first round of VC	N (US patent apps)	Increase in patent counts slightly smaller if VC investment larger, controlling for industry and year; graph shows plateau after receiving investment
Engel and Keilbach	2004	Firm level implications of early stage VC investment—an empirical investigation	Germany	All mfg + ptt + bus services	1995–1998	142 VC-backed firms; 21, 375 non-VC-backed firms	German patent filings after foundation	(VC-backed)	Patent filing before foundation date strongly predicts VC involvement later, but VC involvement is only weakly associated with further patenting
Kortum and Lerner	2000	Assessing the contribution of VC to innovation	United States	mfg	1983–1992	2-digit industry data from NSF + Venture economics	Granted US patents by app date, contemporaneous with VC funding	VC funding amounts	Using 79 change to pension fund rules as instrument, find that VC funding 3–4 times as productive for patents. Some problems associated with incomplete industry controls

Table A3. Literature on the impact of patenting on startup firm performance

Author	Date	Title	Country	Industry	Years	Sample	Dep var	Patent var(s)	Results
Farre-Mensa, Hegde, and Ljungqvist	2016	The bright side of patents	United States	All	2001–2014	1st time for-profit new US patenters, no patents 1990–2000	3 and 5 year E and S growth, acq prob, follow-on innovation	D (pat grant); #follow-on pats (# granted); exam delay	Conditional on first patent app; uses examiner assignment instrument; Patents increase growth, jobs, innovation, and investor returns. Delays in examination reduce this benefit
Helmers and Rogers	2011	Does patenting help high-tech startups?	UK	High and medium tech	2000	All UK SMEs	Growth 2001–2005; survival innovation	D (UK pat app); D (EP pat app)	Control for samp sel and simultaneity; patenting increases growth 26–27% per annum (only 6.3% have patents); also strongly correlated with survival
Wagner and Cockburn	2010	Patents and the survival of internet-related IPOs	United States	Internet	1998–2001 (IPO)	Internet firms with IPO on NASDAQ, 63% VC-backed;	Survival from IPO	D (pat app); D (pat app in 705); N of pats with >6 cites	Firms with one patent have a 32% lower prob of exit either via acq or bankruptcy at 5% level; 705 patents do not matter; many cite delay exit via acquisition; only 42% have patents. VC backed firms less likely to fail, more likely to be acquired