Early individual stakeholders, first venture capital investment, and exit in the UK startup ecosystem^{*}

Albert Banal-Estañol[†], Inés Macho-Stadler[‡]

Jonás Nieto-Postigo[§] and David Pérez-Castrillo[¶]

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Abstract

We analyze the effects of the pre-institutional individual stakeholders on the eventual success of the startups. We show that the quantity and experience of founding and non-founding directors and other individual investors affect the startup's type of, and value at, exit. While for founding and non-founding directors it is the number, for the other individual investors it is the presence of experienced business angels that significantly influences success. We also report indirect effects of the same pre-institutional individual stakeholder attributes on success. Indeed, they also affect the characteristics of the first venture capital investors, which in turn influence success.

JEL Classification numbers: M13, G32, G24

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^{711),} ICREA under the ICREA Academia programme, and Severo Ochoa Programme (SEV-2015-0563). [†]Universitat Pompeu Fabra and Barcelona GSE. Email: albert.banalestanol@upf.edu.

[‡]Universitat Autonoma de Barcelona and Barcelona GSE. Email: ines.macho@uab.es.

[§]Universitat Autonoma de Barcelona. Email: jonas.np10@gmail.com.

[¶]Universitat Autonoma de Barcelona and Barcelona GSE. Email: david.perez@uab.es.

1 Introduction

Startups are a major source of innovation and technological development and thus key drivers of economic growth. Undoubtedly, the early stages of the startup, particularly before the introduction of venture capital (VC) investment, are crucial. In this "preinstitutional" period, the individual stakeholders, i.e., founders, directors and other individual investors, including the business angels (BA), play a paramount role.¹ Still, and despite of their importance, we have very little systematic evidence on the relevance and differential influence of the individual stakeholders in the early stages of the startups.

This paper investigates, making use of a novel dataset of UK-based VC-backed startups, the effects of the pre-institutional individual stakeholders on the eventual success of the startups. We show that the quantity and experience of founding and non-founding directors and other individual investors affect the startup's type of, and value at, exit. But, while for founding and non-founding directors it is the number, for the other individual investors it is the experience of BA investors that has a significant influence on success, particularly, through an increase in the likelihood of exit through acquisition. These features also enhance the startup's intermediate and final valuations. We also report indirect effects of the same pre-institutional individual stakeholder characteristics on success, via VC investment. Indeed, these individual characteristics affect the type, quantity and quality of the first-VC investors, which in turn influence startup success.

So far there exists very little systematic information and data about the individual stakeholders of the startups. This is for at least two reasons. First, individuals (e.g., BAs) may be reluctant to reveal their identity and share information about their activities, both for strategic reasons as well as to avoid personal exposure (Kaplan and Lerner, 2016). Investments made on an individual basis are often not subject to regulatory disclosure requirements (e.g., in the US). Second, most databases on startups, such as VentureXpert (VX) and Venture Source, emanate from surveys of venture capital firms (Da Rin et al., 2013). As a result, they contain relatively good information about the VCs and their investments but they possess much less information about individual investors, founders

¹The investments of non-founding individuals and the importance of the business angels (BA) appear to be growing over time everywhere. Estimates suggest that the total size of BA investment has long surpassed VC investment in the US and increasingly in some other countries as well (Lerner et al. 2018).

or directors, particularly before the introduction of VC investment.²

To analyse the relevance of the individual stakeholders in the startup ecosystem, we have created a novel, comprehensive dataset of UK-based VC-backed startups, with extensive information on ownership, control and valuation. In contrast to many other countries (e.g., the US), the UK requires all private companies -even the very small ones- to submit mandatory filings to Companies House (CH), the registrar of companies.³ Among others, each company has to fill extensive details on the identities of its shareholders and directors as well as details on share issuances, including the share price, which determines the valuation. Moreover, given the legal nature of these documents, the information collected should be more accurate than that obtained through surveys, which is the usual source of information of most of the existing startup databases (Da Rin et al., 2013).⁴

Our database provides, first, descriptive evidence about the relevance of the individual stakeholders in startups. Individuals, despite accounting for only 11% of the total investment, represent 84% of the body of startup investors, while institutions account for 81% of the investment but only 11% of the number of investors. The different types of individual stakeholders also differ in terms of number and investment. Founders provide an important part of the individuals' investment (26%) while representing only 10% of them in number. Still, 15% of the founding directors never invest in their company. Nonfounding directors represent a large part of the individual stakeholders (35%). Although only one out of five invests in the startup, when they do, they invest similar amounts as the founders (£76K vs £64K). Other individual investors represent the most important category of individual stakeholders, both in terms of number (55%) and investment (55%). But they invest on average less than founders and directors, £25K per company.

In terms of institutional investors, our database includes, in addition to independent and corporate venture capitalists (IVCs and CVCs, respectively), as most databases,

 $^{^{2}}$ A few papers (e.g., Hellmann and Puri, 2000, Hsu, 2004) also use hand-collected data, mostly through surveys or proprietary databases. However, the scope of some of these studies may be limited by the size of the sample and the private source of the data makes the analysis difficult to replicate.

³As ackowledged by Kaplan and Lerner (2016), VCs are typically not required to submit much information to the United States Securities and Exchange Commission or other regulators, after the Investment Company Act of 1940.

⁴We believe that our database will be the first that includes a wide sample of the VC-backed start-ups in any country that has information on the identity of all the shareholders and directors at each point in time and on the number and value of the shares owned by each shareholder at each point in time.

less structured and organised institutional investors, such as corporate venture investors (CVIs) and organisation venture capitalists (OVCs). We define CVIs and OVCs as companies that invest in startups without the structure of a formal venture capital fund, and not-for-profit/government institutions, respectively. CVIs represent an important part of the number of institutional investors (29%) although they account only for 4% of their total investment. IVCs, on the other hand, account for 58% of the number of institutional investors and 86% of their total investment. We define as first-VC or first institutional investment, the first time that one of these four types of investors invest in the startup.

In terms of startup exit, about 39% of the companies in our database can be considered "successful," defined, following prior literature, as exiting in the form of an Initial Public Offering (IPO) or a Merger and Acquisition (M&A) (6% and 33%, respectively), whereas the rest end up dissolved or remain "active" without exit (44% and 17%, respectively). Despite of the significant differences in terms of final valuation, the average investment and valuation at first-VC investment do not differ significantly between eventually successful and unsuccessful ventures. Given that we use legally-binding data, we can also assess the accurateness of the attributions of exit routes, as well as of institutional investments, performed by the standard VX database. Not surprisingly, the most inaccurate assignment in the VX database is the "active" category. Instead, the classifications of the firms exiting through IPOs and those ending dissolved are the most accurate, in the sense that those classified as such are indeed IPOs and dissolutions, respectively.

Our regression results show how the characteristics of the startup's early individual stakeholders, i.e., founders, directors and other individual investors, affect the likelihood that the startup exits through an IPO or an M&A. Success is more likely in startups that have had larger founding teams, appointed greater number of non-founding directors, and included experienced BAs among its investors, before the first-VC investment. Decomposing the effects on IPOs and M&As, we show that the characteristics of the early individual stakeholders affect the likelihood of M&As significantly more than the one of IPO. Still, the same three startup features positively affect startup valuation at 3 and 5 years since first-VC investment, and startup final valuation, whenever it occurred.

We find that the quantity and experience of the early individual stakeholders also affect the characteristics of the first-VC investment, in terms of type, quantity and quality of the first-VC investors. We show for instance that startups with larger number of founding and non-founding directors are more likely to have IVCs as first-VC investors. The presence of an experienced BA investor makes it more likely that the startup will have an IVC but less likely that it will have a CVC. As the individual stakeholders affect the characteristics of the first-VC investment, there are not only direct but also indirect effects on success. Indeed, the number of founders and non-founding directors, as well as the presence of a BA, make it more likely that the startup will have an IVC at first-VC investment, and the presence of an IVC increases the likelihood of IPO or M&A. We show that most but not all these indirect effects pull in the same direction as the direct ones, and complement the direct effects of the early individual stakeholders on the success of the startup.

Our regressions treat the pre-institutional characteristics and the characteristics of the first-VC investment as predetermined at exit date. Similarly, the pre-institutional characteristics are predetermined at first-VC investment. Thus, our effects should be interpreted with caution. Reassuringly, though, the average investment and valuation at first-VC investment are not significantly different between eventually successful and unsuccessful ventures, despite exhibiting significant differences at exit. Moreover, the pre-institutional characteristics are not correlated with the size of first-VC investment.

The rest of the paper is organized as follows. Section 2 discusses related literature. Section 3 describes our unique database. Section 4 provides details on the definition of the variables. Section 5 presents the results. Section 6 concludes.

2 Related literature

Our paper contributes to the scant literature that studies the effect of the personal characteristics on the startups' eventual success, as well as to the literatures that study the influence of the individual stakeholders on VC financing and the subsequent effect of the characteristics of the VC firms on the performance of the startups they finance.

2.1 Pre-institutional features and startup performance

Few papers have studied the effect of the startup's founders, non-founding directors and other early individual investors on the startup's final performance. Some papers have analysed the effects of the experience and the size of the founding team. Using a sample of Italian new technology-based firms, Colombo and Gilli (2005) find that founders' prior entrepreneurial experience positively affects startup growth. Colombo and Gilli (2010) further this result by showing that the founders' human capital, in addition to an indirect effect through the attraction of VC financing, has a direct positive effect on growth. Gompers et al. (2010) find that entrepreneurs with previous positive achievements are more likely to succeed in their current startup than previously unsuccessful serial entrepreneurs, who have similar odds than those who are entrepreneurs for the first time (see also Cooper and Bruno, 1977, and Van de Ven et al., 1984). Another characteristic of the founding team which has been studied is its size. The results by Cooper and Bruno (1977) and Roure and Madique (1986), obtained with relatively small samples, suggest that the founders of more successful companies had larger, more complete, teams.⁵

A few other papers have analysed the effects of involving an experienced individual investor, a BA, throughout the life of the startup on startup performance. Using confidential records from two prominent US BA investment groups during the 2001-2006 period, Kerr et al. (2014) find that firms that received BA funding are more successful overall: they are more likely to survive for at least four years and to have a successful exit through either an IPO or an acquisition. Similar results are found in Lerner et al. (2018) using data of investments by BA groups across a heterogeneous set of 21 countries. However, Goldfarb et al. (2013) find that mixing BAs and VCs has a negative effect on startup performance: for startups where the deals are larger, being financed only by VCs increases the likelihood of success compared to receiving financing from at least one BA.

2.2 Pre-institutional features and VC investment

The effect of the pre-institutional characteristics of the startup on the type of VC funding has been studied, to our knowledge, only by Sørensen (2007). As Sørensen (2007), we do not address the question of which startups obtain VC financing, but we investigate the features that make a VC-backed startup more likely to receive financing by particular types

⁵Kaplan et al. (2009), using information from about 50 VC-funded start-ups that went through an IPO, find that founders often depart and managers are often replaced in successful companies, whereas the business idea does not change since an early stage in the companies' life. Their study suggests that founders may have a strong influence in raising the initial capital but the founders' abilities may not be necessary in later stages of the firm. In fact, those start-ups where founders are still in control may have significantly lower valuation than those in which the founders have relinquished control (Wasserman, 2017).

of VCs than others, and which are the characteristics of the first-VC transaction. Sørensen (2007) finds that better startup companies attract more experienced VCs, defined in terms of participation in previous investment rounds.

A larger literature addresses the complementary question of the effects of the individual stakeholders on the likelihood that the startup obtains VC financing. In terms of the founders, surveys of VC investors (MacMillan et al., 1985) have long suggested that the founders' prior experience is an important selection criteria for VCs. This result has been supported, among others, by Hsu (2007) and Beckman et al. (2007). Shane and Stuart (2002) show that founders having previous relationships with venture investors are more likely to receive VC funding. Bernstein et al. (2017) find that investors, and in particular experienced investors, are highly responsive to information about the founding team.

In terms of the effects of the presence of BAs, Lerner et al. (2018) report that BA funding helps startups obtain VC funding, although Kerr et al. (2014) find no significant effects. The results by Lerner et al. (2018) and Lindsey and Stein (2018) suggest the existence of complementarities between the two sources of financing. However, Hellmann et al. (2017) find a substitute pattern between BAs and VCs: obtaining more BA financing makes a startup less likely to subsequently obtain VC funding, and vice versa.⁶

2.3 VC investment and startup performance

The positive influence of institutional investors on startup performance is well documented (see, for instance, Giot and Schwienbacher, 2007, Chemmanur et al., 2011, Puri and Zarutskie, 2012, and Bertoni and Tykvová, 2015). However, how the specific characteristics of these VCs affect the success of the venture is much less well understood.

The issue that has received the most attention from the literature is the differences between CVCs and IVCs. CVC funds are said to not only care about the monetary returns of their investments but also about strategic returns, such as the development of related business (Dushnitsky and Lenox, 2006, Hellmann et al., 2008) and are argued to provide non-financial resources to support the startups (Riyanto and Schwienbacher, 2006, Chemmanur et al., 2014). Because of these differences, the likelihood of going to an IPO

⁶Conti et al. (2013) study the influence of the initial personal investments on follow on financing. They find that the money committed by the initial investors has a positive influence on future BA investments but it has no effect on VC investment.

(versus being acquired) should be lower for CVC-backed than for IVC-backed startups (Hellmann, 2002, Riyanto and Schwienbacher, 2006). While Cumming (2008) and Kim and Park (2017) confirm this intuition, Gompers and Lerner (2000) and Chemmanur and Loutskina (2008) find the opposite result. Park and Steensma (2012) also obtain that the likelihood of an IPO is higher for CVC-funded ventures, but only when they require complementary specialized assets. Guo et al. (2015) find that CVC funding influences the choice between IPO and acquisition through two channels: CVC-backed startups receive larger investment levels (which leads to more IPO exists) and have longer duration before exit (which pushes towards more acquisitions). They suggest that the contradictory results found in the literature may be due to the differential strength of the two opposite effects in different markets.

The characteristics of CVC and IVC funds seem to have a weaker influence on the success rate of the startups than on the type of exit in case of success.⁷ Chemmanur and Loutskina (2008) conclude that CVC-backed startups have a higher rate of successful exit, although the effect is not significant. Similar insignificant results are reported by Guo et al. (2015). Still, Dushnitsky and Shapira (2010) obtain that CVC-backed startups are more successful. Also, Park and Steensma (2012) find that startups that require specialized complementary assets or operate in uncertain environments and which receive CVC funds are less likely to fail compared with those that only receive IVC funds.

Very few papers have studied the causes or the consequences of other characteristics of the VC investment. For instance, we know very little on the characteristics of the startups that lead a top VC to invest in them, or the consequences of receiving investments from top VCs. In his influential paper, Sørensen (2007) uses a structural model based on the two-sided matching model to separate the effects of funding by an experienced VC due to sorting from those due to its differential added value. He finds that being funded by more experienced VCs increases the likelihood that a startup goes public because of both effects: they invest in better companies and they add more value to these companies. His results also suggest that sorting is almost twice as important as influence with respect to the positive effect of experienced-VC funding on the IPO rates.⁸

⁷Colombo and Murtinu (2017) also find only small differences in the positive influence of the two types of VC on the long-term overall economic performance of start-ups, although the short-term effect is more significant for IVCs than for CVCs.

⁸The experience of the VC managers also seem to play a role in the timing and underpricing of IPOs.

Finally, some papers have studied the effect of VC syndication on the startups. As illustrated by Lerner (1994), syndication of VCs in startups is common, even at the first-round of investments. Brander et al. (2002) find that syndicated investments add value to the startups, a result that is also obtained in Cumming and Walz (2010). However, Chahine et al. (2012) stress that VC syndication diversity result in conflicts of interest because of goal incongruence among VC syndicate members.

3 A unique database

To create a comprehensive dataset of UK-based VC-backed startups, we used mainly the mandatory filings submitted to Companies House (CH), the registrar of companies. This section describes this unique database and provides descriptive evidence of the relevance of the individual stakeholders in startups as well as an assessment of the institutional investments and exit classifications offered by the VentureXpert (VX) database.

3.1 Sample definition

We first had to identify the startups within the universe of UK firms. To do so, we searched for VC investments in UK companies in the VX database.⁹ According to Maats et al. (2011), VX has the most comprehensive investment coverage of the two main VC databases (VX and VentureSource), so our VX investment-based search should guarantee that we obtain a large sample of (VC-backed) startups.

We identified all the UK-headquartered companies that received, according to VX, their first-VC investment between 1999 and 2005 (both inclusive), and were incorporated on or after 1995. We obtained all the available information in CH for these companies (de-

⁹We excluded investments in companies in Northern Ireland because they use a different type of document which was not provided to us. Throughout, when we refer to the UK we mean Great Britain (i.e., the UK excluding Northern Ireland).

Gompers (1996) finds that young VC firms, which are eager to signal their ability to be able to raise further capital, take companies public earlier than established VC firms. Moreover, being funded by a less-experienced VC leads to a higher underpricing at the IPO. VC-backed IPOs also suffer larger underpricing than comparable non-VC-backed IPOs (see, for instance, Lee and Wahal, 2004). Pollock et at. (2010) also find that prestigious VCs have a positive effects on IPO valuations of the start-ups that they finance, compared to those supported by less-prestigious VCs.

scribed below), from incorporation until up to 5 years after first-VC investment. Although they still need to fill annual returns, UK companies are not required, since October 1st 2009, to report the details of the "allottees" (investors that bought shares at issuance). Therefore, we collected information on firms receiving first-VC investment up to 2005 (and not more recent ones) to have full information for at least 4 years since first-VC investment. We ended up with a sample of 1,044 unique UK-based startups.¹⁰

3.2 Source documents and investors

For each company, we obtained, from incorporation date until 5 years after first-VC investment or "exit date" (both to be defined below), whichever came earlier:

• "The Return of Allotment of Shares" (RAS) documents, i.e., the share issuances, which include, for each allottee, the name as well as the number, class (e.g., common, preferred, etc), nominal value and price paid for the shares issued, as well as the date.

• The Annual Returns (AR) documents, which include the (accumulated) number, class, and nominal value of the shares held by each shareholder as well as the AR date.¹¹ While RAS are submitted whenever there is a share issuance, ARs are submitted one year after incorporation and each year thereafter.¹²

We dropped 134 companies because of missing/inconsistent information.¹³ Our final sample includes thus 910 companies.

We manually classified the investors identified in the RASs and ARs into "individuals" and "institutions."¹⁴ Panel A of Table 1 shows the distribution of (unique) investors in

¹⁰We identified a sequence of different CH companies with the same shareholders, directors and, sometimes, the same or similar company names. In other words, some companies have "precursor" and/or "sequel" companies which, despite being legally different entities, should in practice be considered the same company. We merged all the information of precursor and sequel companies into one single company (94 companies have at least one precursor/sequel).

¹¹The RAS document was formally called form 88(2) before October 2009, and form SH01 after October 2009. The AR was also called form 363 before October 2009, and form AR01 after October 2009.

¹²Note that sales of shares between investors do not have to be submitted in CH. These transactions can be identified from the ARs in two subsequent years. But we do not have the transaction price; therefore valuations can only be done based on the price reported in the RAS. Moreover, we cannot identify two subsequent share transfers within the same year, although it should happen in rare cases in start-ups.

¹³We made sure that the total number of shares of each class held by all the investors is equal to the number of shares displayed in the AR's "Statement of Capital."

 $^{^{14}}$ We identified unique investors across companies, taking into account that the names may be slightly

our database, both in terms of number of investors as well as the size of their investments. Individual investors, despite accounting for the 84% of the number of investors, bring only 11% of the total investment. Institutions, despite being only 11% of the body of investors, account for 81% of the total investment. The rest of the investors (5%), which include those in tax-haven countries or "nominee" companies (financial intermediary companies created to hold shares on behalf of third parties), are unknown/undisclosed (they could be institutions or individuals).

[Insert Table 1 here]

3.3 Founders, non-founding directors, and other individual investors

We obtained the list of the directors of our startups from the FAME database, which collects some of the information of CH. We identified unique directors across companies, taking into account that the names may be slightly different. For each director in each company, we obtained his/her appointment date and resignation date (if any).¹⁵ The directors of a given company can be investors of that company or not.

We rely on the RAS and AR forms to identify the startup founders, as many startups are set up through an acquisition of a "shelf" company, so the information of the incorporation documents is often misleading.¹⁶ We considered a director of the company a founding director or a "founder" if either (i) s/he is an investor in the first year (or, in case the first VC invested within the first year, if s/he is an investor strictly before the VC invested), or (ii) s/he was appointed in the first 45 days of the company (or, in case the first VC invested within the first 45 days, if s/he is appointed strictly before the first-VC invested).

different. We also considered the same investor the subsidiaries of the same corporate investor and the funds of the same VC firm. To identify the funds of the VC firms, we make use of the information available in VX about the VC firms that invest in our companies.

¹⁵We classify as directors all the individuals that have been or will be directors at some point in the company. Therefore, being "director" or not is a static attribute of a person in a company, but the same person may be a director of a company but not of another.

¹⁶A shelf company is a company that has been incorporated and "put on the shelf" without having ever traded, for its later sale. They can be purchased in order to save time and skip the -sometimes tedious-incorporation process.

Panel B of Table 1 shows the number and the investment of the individuals in our sample, separated into founders, non-founding directors and "other" (i.e., non-director) individual investors. Note that the individuals in this table are not unique but they appear as many times as the number of companies they are present in. The same person may, for instance, be a founding director in one company and an "other individual investor" in another one.

Not surprisingly, founders represent an important source of investment for the startups in relative terms, by investing 26% of the total individuals' investment while representing only 10% of the number of individuals. A proportion of 15% of them never invest in the company though. Non-founding directors represent a large part of the individuals in our database (35%); the average company has 9.5 of them, as opposed to 2.7 founders. Although only one out of five invests in the startup they direct, when they do invest, they invest similar quantities as founders: an average of $\pounds 76K$ for founders vs $\pounds 64K$ for non-founding directors. Other individual investors represent the most important category with more than half of the number and investment (6% of the total, institutions included). Each of these individuals invest on average $\pounds 25K$ per company.

3.4 Institutional investors and first-VC investment

We classified institutional investors into IVCs, CVCs, CVIs and OVCs. To do so, we first matched the institutional investors with the companies in the Orbis database. A matched investor is considered an IVC if its NACE code in Orbis is in the finance or management consulting areas. A matched investor in any other NACE code is considered a CVC or a CVI. We distinguish CVCs, corporations investing in startups through structured and organized funds, by searching whether they are present in the overall VX database (that is, investing in any startup included in VX, not only those in our sample). Not-for-profit/government organizations are categorized as OVC.¹⁷

Panel C of Table 1 depicts the distribution of (unique) institutional investors in our database, both in terms of number as well as the size of their investments. IVCs represent the main body of institutional investors, accounting for more than half of the investors

¹⁷Other institutional investors include research institutions and employee schemes. We do not use them to define first-VC investment because they do not take an active part in the money disbursement. Research institutions often get ownership in exchange of technology transfer.

and 86% of the investment. CVCs, despite representing only 4% of the institutional investors, account for 7% of the institutional investors' investment. CVIs, on the other hand, representing 29% of the investors, but only 4% of the investment.

We define as first-VC investment, the first time that one of these types of investors invest in the startup. Note that this may be earlier than the first-VC investment according to the VX database. This is because some of the IVC/CVC investments in the startups are not included in VX or because the first institutional investor is a CVI (see below).

3.5 Investment, ownership and valuation

We computed the overall cumulative investment in each company at each point in time. To do so, we added the money invested by all the investors in all share classes in all the RAS up to that point in time, where money invested is defined as the product of the "price paid" and the "number of shares allotted" in that RAS. In our data, the cumulative investment is, on average, $\pounds 124K$ just before first-VC investment, $\pounds 1.4m$ at first-VC investment and $\pounds 5.4m$ at 5 years after first-VC investment or exit, whichever came earlier.

We computed the ownership structure at each point in time by computing the fraction of the overall nominal capital held by each investor.¹⁸ Nominal capital for each investor in each point in time is computed by multiplying her/his number of shares by their nominal value (and adding the nominal capital of her/his ordinary, preferred and other shares). We computed the end-of-the-year nominal capital from the ARs. We also computed the nominal capital at intermediate dates of the submission of the RASs. Figure 1 depicts the ownership structure prior to first-VC investment, at first-VC investment and at exit, for the average company.

[Insert Figure 1 here]

We valued the companies at each RAS. To do so, we first constructed a "premium multiplier" for the ordinary shares of each RAS, defined as the (maximum) ratio of the

¹⁸We cannot use the number of shares as there are shares of different nominal value. For instance, 10 ordinary shares at a nominal value of 2 are worth twice as much as 10 ordinary shares at a nominal value of 1.

price paid per share divided by the nominal capital of that share.¹⁹ The valuation is obtained by multiplying the overall (i.e., company-wide) nominal ordinary capital by the premium multiplier to which we added the nominal preferred and other capital.²⁰ The valuation for the average startup is $\pounds 1.8m$ just before first-VC investment (the pre-money valuation), $\pounds 2.6m$ at first-VC investment (the post-money valuation) and $\pounds 8m$ 5 years after first VC-investment or exit, whichever came earlier.

3.6 Type of exit and final valuation

We now explain how we identified the type of "exit" of each startup, which may be earlier or later than the five years after first-VC investment. We identified the 55 *IPOs* in our dataset, which represent the 6% of the startups (see Figure 2), with a search in the major stock exchanges (although almost all of the IPOs in our database are in the London Stock Exchange). We identified the 298 $M \mathscr{C}As$ (33% of the companies) as cases in which another company buys all the shares of the startup (or, in very rare cases, a majority controlling stake). Finally, we identified the 400 *dissolutions* (i.e., 44% of our sample) as the appointment of an administrator/liquidator, as this is the time the company stops trading (final closure usually happens several years later). If none of this occurs by the end of 2017, the company is considered *active*.²¹

[Insert Figure 2 here]

¹⁹Note that different investors may pay different prices, so we took the maximum price paid. We did not count (i) shares issued to directors, as they may contain options, (ii) shares whose price paid was equal to the nominal value, or RASs where (iii) the total investment was lower than $\pounds 20,000$ or (iv) the capital issued was less than 5% of the total capital.

 $^{^{20}}$ We did that because the preferred and other capital behave like debt (multipliers larger than 1 are rare for non-ordinary shares). We run regressions using other definitions of valuation, including a premium multiplier that used information from preferred shares. The results of the regressions are very similar to those reported in the next sections, even though the magnitude of the valuation are different.

²¹We identified 57 (6%) companies that exited through a management buy-out/buy-in or a repurchase. Management buy-out/buy-ins were identified as cases in which a company owned by the directors of the same company (for buy-outs) and from another company (for buy-ins) acquired all the shares of the startup. Repurchase happens when the VC exits the company but the company is still independent and active (sometimes the shares are redeemed, or they are bought back by the company). We include them in the active category, following VX's approach.

We computed the final valuation, at exit, independently if this occurred before or after 5 years from first-VC investment, as follows. For IPOs, we took the market capitalization at the end of the first trading day. For M&As, we manually searched for the acquisition price in press releases of the acquirers, and complemented it through web search.²² In case of dissolution, we assigned a final value of 0. We could not compute a final valuation for "active" companies (the assigned value is thus missing).

Figure 3 shows the cumulative investment and the valuation before first-VC investment, at first-VC investment, and at exit for the average company in each type of exit.

[Insert Figure 3 here]

Cumulative investments, despite being substantially different at the end across exit types (in order, IPO, M&A, active, and dissolved), they are relatively similar at first-VC investment. The average investment at first VC investment is not significantly different between eventually successful (IPOs and M&As) and unsuccessful ventures (active, and dissolved): t-statistic= -0.13 and p-value= 0.89.

We also observe that companies exiting through M&A and IPOs, despite having higher final valuations, have similar valuations at first-VC investment than the other companies. The average valuation at first-VC investment is not significantly different between eventually successful and unsuccessful ventures: t-statistic= 0.19 and p-value= 0.84.

3.7 Comparison with the VX database

Given the legal nature of the CH documents, our information should be more accurate than that obtained through surveys, which is the usual source of information of most of the existing startup databases (Da Rin et al., 2013). We now compare the exit routes, as well as the number and the investments of IVCs and CVCs, in our database with those identified by the VX database. Note that individual investors and CVIs are not included in the VX database.

Table 2 compares the exit routes according to VX (columns) with the actual exit routes (rows), both defined as of the end of 2017. Not surprisingly, the most inaccurate category

 $^{^{22}}$ We introduced, in case milestones or any type of variable payment that was included in the deal, the maximum possible amount, as variable payments occur rather often. Still, in more than 50% of the M&A cases, though, the price was not disclosed by the acquirer or it is unknown.

in the VX database is the "active" category: 287 out of the 509 companies classified as active by VX at the end of 2017 were actually dissolved at that date. Only 124 out of this 509 were correctly classified as active. 202 out of the 292 companies classified as exiting through an M&A had actually exited through an M&A. Instead, the classification of the firms exiting through IPOs or ending dissolved is more accurate: 33 out of 36 were correctly classified as IPO and 60 out of 73 were correctly classified as dissolved. There are, however, 22 startups that exited through an IPO and 340 startups that were dissolved whose exit is not correctly identified in VX.

[Insert Table 2 here]

Panel A of Table 3 compares the number and overall investment of three (out of the four) types of institutional investors in the set of firms in our database with those attributed by the VX database. To compute the overall investment according to VX, we use the VX's investor variable "Fund Estimated Equity Invested in Company at Investment Date" to identify the size of all the investments in these companies of these investors.

[Insert Table 3 here]

The table shows that VX includes 416 out of the 1, 188 IVC investors of our database. But the IVC investments included in VX are the largest, and in fact VX overestimates the overall investments of IVCs (101% of our recorded investment). In terms of CVC investment, VX includes 54 out of the 86 investors, representing 99% of the overall investment by these type of VC in our database. Finally, VX includes 10 out of the 38 OVC investors, representing 60% of the overall investment by these type of VC.

Panel A does not take into account that over- and underestimation might cancel out across companies. This is why we report in Panel B how often the VX investment data matches the size of the investment in our startups, allowing for an error margin of $\pm 20\%$. We report the number and percentage of startups for which VX matches, underestimates and overestimates the size of the investment of each investor. VX does well in capturing the overall VC investment but, at the individual-firm level, most of the investments included in VX either overestimate or underestimate the figures reported by firms to CH.

4 Variables and descriptive statistics

We now describe the variables used in the empirical analysis. We construct company-level variables that characterize (i) the number and experience of the individual stakeholders in the *pre-institutional period*, (ii) the type, quantity and quality of the first-VC investors at *first-VC investment* as well as the characteristics of the transaction itself (i.e., investment, ownership and governance) and (iii) the type of and valuation at *exit*. We provide a summary description of the variables in Table 4, as well as descriptive statistics and correlations of the main variables in Tables 5 and 6, respectively.

[Insert Tables 4, 5 and 6 here]

4.1 Pre-institutional period

We construct variables describing both the "quantity" and "experience" of the three types of individual stakeholders. In terms of quantity, we define the count variables "num members founding team," "num early non-founding directors" and "num other early individual investors." As shown in Table 5, on average, the startups in our sample have 2.71 founders, 0.96 non-founding directors and 2.52 other early investors prior to first-VC investment.²³ In terms of correlation, Panel A in Table 6 shows a negative correlation between the size of the founding team and the number of early non-founding directors.

We created several variables to characterize the experience of each of these types of individuals. In the case of the founding team and the set of early non-founding directors, we created dummy variables that identify the presence of one with experience as a director, i.e., someone that has been previously a director in one of the companies in our database. In our dataset, 11% of the startups have a founder with experience in directing and 7% have an early non-founding director with that experience. We also created a dummy variable that identifies the presence of a BA. We consider an individual a BA if s/he (i) has invested, throughout our database, in 2 or more companies and has invested, in total, $\pounds 100,000$ or more, or (ii) has invested in 6 or more companies. We identified a total of

²³A few start-ups have zero founders because they were created with VC investment.

340 unique BAs in our database (2% of the individual investors).²⁴ Around 12% of our startups have a BA prior to first-VC investment.

As control variables, we include the "startup age at first VC," in terms of number of years since incorporation, and the "money inv before first VC" as the (cumulative) investment just before first-VC investment (including the small investments of research institutions and unknown investors). On average, our startups are 1.52 years old at first-VC investment, and got 124K pounds worth of investment. We also include a dummy for the presence of a research institution within the early investors. Around 11% of the startups include a research institution before the first-VC investment.

4.2 First-VC investment

We characterize the type, quantity and quality of the institutions investing at first-VC investment. We created four dummy variables that indicate whether the first-VC investment includes an IVC, a CVC, a CVI and an OVC, respectively. As a measure of quality, we create a dummy variable for the presence of a "top IVC," defined as (i) being in the top 5% of the IVCs in terms of overall investment within our dataset, and/or (ii) being in the top 25% in terms of capital under management within the VX database (IVCs that, despite being large and experienced, do not invest heavily in the UK). Roughly 10% of the IVCs in our database are considered top IVCs. Finally, we define the "number of VC investors" as the count of VCs (of any of the four types) at first-VC investment.

In terms of investment, ownership and governance, we define the following variables. "VC money inv at first VC" includes the overall amount of money invested by VCs at first-VC investment. "% ownership by VCs at first VC" is defined as the percentage ownership stake obtained by all the VCs at first-VC investment. "VC director app at first VC" is a dummy variable that identifies whether the VC investors appointed a director at first-VC investment. We consider that VC investors appoint a director if a new director is appointed precisely at the date of the first-VC investment.

²⁴The identification of "business angels" is always problematic and whether an individual should be considered a business angel or just an investor is somehow arbitrary. Mason and Harrison (2008) review several approaches to measure the investing behavior of BAs.

4.3 Exit

As measures of performance, we define, according to the exit routes of the startup, the dummy variables "IPO", "M&A" and "success." Following prior literature, success includes exits as both IPO and M&A.²⁵ We also use the "final valuation," as described in the previous section (which can be before or after year 5). Finally, we also use the "valuation at year 3" and "valuation at year 5" since first-VC investment, defined as the linearly-interpolated value between the valuations at each RAs after 3 and 5 years after first-VC investment (and using a value of 0 at incorporation and the final valuation at exit). The value of these variables is equal to the final valuation if exit occurs before.

5 Results

We analyze in turn the effects of the pre-institutional individual stakeholders on the characteristics of the first-VC investment, as well as the effects of the pre-institutional individual stakeholders and the characteristics of the first-VC investment on startup success.

5.1 Early individual stakeholders and first-VC investment

Table 7 shows the effects of the pre-institutional stakeholders on first-VC investment using probit and OLS regressions. We regress the characteristics of the first-VC investors and the first-VC transaction against the characteristics of the early stakeholders. In all regressions we control for startup characteristics such as age and investment at first-VC, location, and industry-year, where year refers to the year of incorporation.²⁶ We cluster the standard errors at the industry level.

[Insert Table 7 here]

²⁵Most papers interpret IPOs and M&As as success events and consider it a failure if the company closed down or remains active after several years (see, e.g., Da Rin et al., 2013).

²⁶We obtained, from the VX database, (i) the city location of the headquarters and (ii) the main industry. In the final dataset, 46% of companies are from London, Cambridge and Oxford, 42% from the rest of England and 12% from the rest of the UK, whereas 58% are in Information Technology, 15% in Medical/Health/Life Science and 27% in Non-High Technology.

Column 1 shows that IVCs are more likely to be first-VC investors in startups with larger founding teams, larger number of non-founding directors and smaller number of other individual investors. Instead, as shown in column 2, CVCs are more likely to invest in startups with greater number of other individual investors. The presence of an experienced BA investor also affects the likelihood of IVC/CVC investment differently: it increases that of IVC while it decreases that of CVC. The presence of BAs, as well as of smaller founding teams, are also more likely to attract CVIs and OVCs, as shown in columns 3 an 4, respectively. On the other hand, the presence of an experienced founder and the number of inexperienced non-founding directors make the CVIs more likely to appear at the first-VC investment whereas the presence of OVCs is less likely. It is worth mentioning that a larger founding team and the presence of experienced non-founding directors not only makes the presence of an IVC more likely but it also increases the likelihood that a top IVC funds the startup. In terms of the quantity of VCs (column 6), startups with greater number of other individual investors, and in particular BAs, are more likely to have more VCs.

Summarizing, the individual stakeholders affect the likelihood of IVC, CVC, CVI and OVC investment, but in different directions. Consistent with this, IVCs and CVCs/CVIs tend not to invest simultaneously at first-VC investment. As shown before in Panel B of Table 6, the correlations between these variables are -0.16 and -0.53 and highly significant. The drivers of CVCs and CVIs are also different between themselves: the correlation between these two variables is -0.10 and highly significant. Panel B of Table 6 also shows that top IVCs tend not to invest simultaneously with CVIs, but there is no correlation between their presence and the investment by CVCs or OVCs.

Columns 7 to 9 show that the individual stakeholders of the startup affect to a lesser extent the first-VC transaction. The size of the investment of the first VCs is barely affected by the characteristics of the individual stakeholders, except for the number of non-founding directors (column 7). In the presence of a greater number of non-founder directors, first VCs invest more but they also obtain a larger share of ownership (column 8). VCs also end up taking a greater ownership stake in firms with smaller founding teams and smaller number of other individual investors. The appointment of a VC director is more likely in startups with smaller and less experienced founding teams as well as those with lower number of non-founding directors (column 9). The presence of a research institution leads to the appointment of a VC director. An interpretation of this result is that the VC investors try to improve the governance of the startup if they perceive it to be weak when they start investing.

5.2 Early individual stakeholders, first-VC investment and exit

Table 8 displays the effects of the pre-institutional individual stakeholders and first-VC investment on exit using probit, multilogit and OLS regressions. We regress several indicators of startup performance against the characteristics of the early stakeholders, as well as on the characteristics of the first-VC investment. As before, in all regressions we control for the characteristics of the startup itself, age and investment at first-VC investment, as well as location, and industry-year. We cluster the standard errors at the industry level.

[Insert Table 8 here]

Column 1 shows the effects of the pre-institutional features as well as of the characteristics of the first-VC investment on success. A startup is shown to be more likely to be successful if it is founded by a large team, appoints a greater number of non-founding directors and involves BA investors before first-VC investment. The effect of the size of the founding team is consistent with the results in Cooper and Bruno (1977) and Roure and Madique (1986) whereas the results on the involvement of experienced BA investors are consistent with the results in Kerr et al. (2014) and Lerner et al. (2018) but go in opposite direction than those in Goldfarb et al. (2013).²⁷

As shown in the previous subsection, these same features are those that increase the likelihood of having an IVCs as first-VC investors, whereas the presence of BA investors decreases the likelihood of CVC investment. The presence of an IVC increases in turn, as also shown in Column 1, the likelihood of success, whereas the presence of CVC investors significantly decreases this likelihood. As a result, the individual characteristics have not only a direct but also an indirect positive effect on success, via IVC and CVC investment.

As other characteristics of first-VC investment have a significant influence on eventual success, there are many other indirect effects. And a few of them pull in the opposite direction of the direct effects. For instance, having a BA investor increases the number

 $^{^{27}}$ Note that the presence of a research institution among the early shareholders decreases the prospect of success.

of VCs, which in turn decreases the likelihood of success. Still, as shown in Column 2, in a regression that drops the effects of the characteristics of the first-VC investment on success, the indirect effects are either relatively weak or cancel each other. Indeed, the significance and even the magnitude of the effects of the pre-institutional features are similar, independently of the inclusion or not of the indirect effects. This is consistent with the results of Sørensen (2007) who shows that the effect of VC funding on success is more due to sorting than to treatment. Our regressions show that IVCs are more likely to invest in startups that have the determinants to be successful, but the inclusion of the indirect effect of these determinants through IVC funding does not alter their direct effect on success.

Columns 3 and 4 use multilogit models to decompose the effects on the variable "success" on the variables of IPO and M&A. Decomposing the effects of founders and non-founding directors, we show first that a larger founding team, or a greater number of non-founding directors, have a positive influence on success but only through M&As and not through IPOs. Interestingly, the presence of an experienced BA investor, despite positively affecting success, decreases the likelihood of IPO.²⁸

Most of the effects of the first-VC investment on success are also due to the effects on M&A. For instance, having a CVC significantly decreases the likelihood of M&A but not of IPO. Having received IVC investment has a positive influence on exiting through both IPO and M&A. However, as shown in columns 5 and 6, which replicate the results in columns 3 and 4 but substituting IVC by top IVC, the effect of the presence of a top IVC is not conducive to IPO (the coefficient is negative although not significant). In any case, these columns suggest that receiving IVC financing is more conducive to a successful exit than obtaining CVC or CVI financing.

Several papers (see, e.g., Bayar and Chemmanur, 2012 and Guo et al., 2015) analyze the choice of exit between IPO and M&A, among the successful startups. The literature acknowledges that VC investors and entrepreneurs may have different objectives regarding the exit strategy. Entrepreneurs earn private benefits if they become managers of a publicly listed firm, which they will not obtain in the case of an M&A (Black and Gilson,

 $^{^{28}}$ Although we do not find a significant effect of the experience of the founders on success, this experience significantly increases the likelihood of M&A. This is line with results by Colombo and Gilli (2005) and (2010) who find a positive effect of founders' previous experience (measured in terms of past entrepreneurial activity and university education) on the start-up growth.

1998; Hellmann, 2006). This makes the entrepreneurs more inclined towards IPOs instead of M&A exits. In contrast, VC investors, in particular IVCs, care about fast financial returns from their portfolio companies, hence they favor immediate exit routes. After an IPO, insiders need to retain a large part of their equity in the firm for some time. Therefore, VCs have a preference for an M&A exit (Bayar and Chemmanur, 2012).

The previous arguments suggest that those startups where VCs (in particular, IVCs) have more control rights should be more likely to exit through an M&A and those where management has more control rights should be more prone to exit through an IPO. In addition to the insights obtained in columns 3 to 6, columns 7 and 8 confirm the previous arguments. These probit regressions on the likelihood of an IPO on the subset of successful startups show that IPO is more likely when (1) the percentage of ownership taken by VCs is smaller, which should give them less control rights; (2) a top IVC is not involved, whose bargaining power could be large; and (3) the number of VCs is larger (for a given level of investment), which should make them weaker in the negotiation with the entrepreneurs.

Moreover, the results also suggest that the BAs' incentives are aligned to those of the VCs: their presence before the first-VC investment makes the IPO exit less likely. The BAs do not obtain any private benefit from the firm becoming public and, after a few years of investment, they may want to collect the benefits.

We should notice that the results are very significant even though we use as a measure of control rights the characteristics at the first-VC investment, and we do not measure control rights at the moment of the exit. Thus, our results also suggest that the first-VC investment has profound implications for the sharing of control over the life of the startups.

Finally, columns 9 to 11 display the effects of pre-institutional features and first-VC investment on valuation. We show that the pre-institutional features have longlasting effects. Startups with larger number of founders, with a larger number of nonfounding directors and being financed by BAs have a larger valuation at the three points in time, often with significant coefficients. The appointment of a VC director at first-VC investment also increases the startup valuation. On the other hand, obtaining finance from numerous VCs who own a large percentage of the startup seem to negatively affect the valuation. Thus, the number of VCs present at first-VC investment not only decreases the likelihood of a successful exit (due to the negative impact on the likelihood of an M&A) but it also leads to lower valuation of the startup. In this sense, our results suggest that syndication is negative for the startup performance. Hence, they are more aligned with the conclusions in Chahine et al. (2012) than in Brander et al. (2002) and Cumming and Walz (2010).

6 Conclusion

Despite of their importance, the relevance and the differential influence of the various types of individual stakeholders of the startups has received scant attention from previous literature. The main reason seems to be the absence of systematic information on the individual stakeholders, particularly in the pre-institutional environment. Indeed, individuals are typically reluctant to reveal their identity and share information about their activities and, in many countries, such as the US, individuals are not subject to regulatory disclosure requirements. Probably because of this, most of the common databases on startups possess very little information on founders, directors and individual investors.

We present, and make use of, a unique database of UK-based VC-backed startups, based on the mandatory filings to the registrar of companies. Our database reveals previously unknown characteristics of the startups. For instance, individuals, despite accounting for a relatively small fraction of the overall investment, represent a large fraction of the body of startup investors. We show that founding and non-founding directors represent around half of the body of individual stakeholders and around half of their investment in the startups, while the other individual investors make up for the rest. IVCs account for more than half of the number of institutional investors and the majority of the investment, while CVIs represent an important fraction of the institutional investors.

We also show that several pre-institutional features have long-lasting consequences for the startup, especially in terms of startup type of, and value at, exit. We argue that the individual characteristics have direct effects on startup success, but also an indirect effect via the characteristics (but not the size) of the first-VC investment, which also affects success. Direct and indirect effects may sometimes pull in the opposite directions, but the indirect effects are shown to be either relatively weak or to cancel each other. Indeed, the magnitude of the effects of the pre-institutional features on success are similar, independently of the inclusion or not of the characteristics of the first-VC investment. We build comparable measures of size and experience of the three types of individual stakeholders in the early stages of the startup. We show, consistently, that governance (founding and non-founding directors) is important in terms of number whereas investment (other individual investors) is important in terms of experience. As they have to work together, the more members the team of founders and non-founding directors have, the more expertise the team has. Instead, in terms of investors, it is important to have at least one of them with previous experience in investing.

We think our database could be used to investigate other questions. For instance, thinking of a startup as a nexus of several stakeholders with potentially different interests (Jensen and Meckling, 1976), we could study the collaboration within as well as across types of stakeholders. We could in particular identify who invests with whom, at the same or in different times, in the same startup or in different startups, i.e., the one-sided matching market of financiers. We could also investigate the two-sided market collaboration formation process between the insiders (founders and directors) and outside investors (that is, VCs and BAs). One could then study the characteristics of the resulting partnerships, that is, which partners are more likely to collaborate with each other. In that analysis, both "horizontal" and "vertical" traits, i.e., those related to affinity (e.g., industry specialization) and those related to ability (e.g., experience) can be important.

References

- Bayar, O., Chemmanur, T. (2012) "What drives the valuation premium in IPOs versus acquisitions? An empirical analysis," *Journal of Corporate Finance* 18, 451– 475.
- [2] Beckman, C.M., Burton, M.D., O'Reilly C. (2007) "Early teams: The impact of team demography on VC financing and going public," *Journal of Business Venturing* 22(2), 147–173.
- [3] Bernstein, S., Korteweg, A., Laws, K. (2017) "Attracting early-stage investors: Evidence from a randomized field experiment," *The Journal of Finance* 72, 509–538.

- [4] Bertoni, F., Tykvová, T. (2015) "Does governmental venture capital spur invention and innovation? Evidence from young European biotech companies," *Research Policy* 44, 925–935.
- [5] Black, B., Gilson, R. (1998) "Venture capital and the structure of capital markets: banks versus stock markets," *Journal of Financial Economics* 47, 243–77.
- [6] Brander, J., Amit, E., Antweiler, W. (2002) "Venture capital syndication: Improved venture selection versus value-added hypothesis," *Journal of Economics & Management Strategy* 11, 423–452.
- [7] Chahine, S., Filatotchev, I., Hoskisson, R. (2012) "The effects of venture capital syndicate diversity on earnings management and performance of IPOs in the US and UK: An institutional perspective," *Journal of Corporate Finance* 18, 179–192.
- [8] Chemmanur, T.J., Krishnan, K., Nandy, D. (2011) "How does venture capital financing improve efficiency in private firms? A look beneath the surface," *The Review of Financial Studies* 24, 4037–4090.
- [9] Chemmanur, T.J., Loutskina, E. (2008) "How do corporate venture capitalists create value for entrepreneurial firms?" W.P. Boston College, Massachusetts.
- [10] Chemmanur, T.J., Loutskina, E., Tian, X. (2014) "Corporate venture capital, value creation, and innovation," *The Review of Financial Studies* 27, 2434–2473.
- [11] Colombo, M.G., Grilli, L. (2005) "Founders' human capital and the growth of new technology-based firms: A competence-based view," *Research Policy* 34, 795–816.
- [12] Colombo, M.G., Grilli, L. (2010) "On growth drivers of high-tech startups: Exploring the role of founders' human capital and venture capital," *Journal of Business Venturing* 25, 610–626.
- [13] Colombo, M.G. and Murtinu, S. (2017) "Venture capital investments in Europe and portfolio firms' economic performance: Independent versus corporate investors," *Journal of Economics & Management Strategy* 26, 35–66.
- [14] Conti, A., Thursby, M., Rothaermel, F.T. (2013) "Show me the right stuff: Signals for high-tech startups," *Journal of Economics & Management Strategy* 22, 341–364.

- [15] Cooper, A.C., Bruno, A.V. (1977) "Success among high-technology firms," Business Horizons 20, 16–23.
- [16] Cumming, D. (2008) "Contracts and exits in venture capital finance," The Review of Financial Studies 21(5), 1947–1982.
- [17] Cumming, D.J., Walz, U. (2010) "Private equity returns and disclosure around the world," *Journal of International Business Studies* 41, 727–754.
- [18] Da Rin, M., Hellmann, T., Puri, M. (2013) "A survey of venture capital research," in Handbook of the Economics of Finance (Vol. 2), Elsevier, 573–648.
- [19] Dushnitsky, G., Lenox, M.J. (2006) "When does corporate venture capital investment create firm value?," *Journal of Business Venturing* 21, 753–772.
- [20] Dushnitsky, G., Shapira, Z. (2010) "Entrepreneurial finance meets organizational reality: Comparing investment practices and performance of corporate and independent venture capitalists," *Strategic Management Journal* 31, 990–1017.
- [21] Giot, P., Schwienbacher, A. (2007) "IPOs, trade sales and liquidations: Modelling venture capital exits using survival analysis," *Journal of Banking & Finance* 31, 679–702.
- [22] Goldfarb, B., Hoberg, G., Kirsch, D., Triantis, A. (2013) "Are angels different? An analysis of early venture financing," W.P. University of Maryland.
- [23] Gompers, P.A. (1996) "Grandstanding in the venture capital industry," Journal of Financial Economics 42, 133–156.
- [24] Gompers, P., Kovner, A., Lerner, J., Scharfstein, D. (2010) "Performance persistence in entrepreneurship," *Journal of Financial Economics* 96(1), 18–32.
- [25] Gompers, P., Lerner, J. (2000) The determinants of corporate venture capital success: organizational structure, incentives, and complementarities," in "Concentrated corporate ownership," University of Chicago Press, 17–54.
- [26] Guo, B., Lou, Y., Pérez-Castrillo, D. (2015) "Investment, duration, and exit strategies for corporate and independent venture capital-backed startups," *Journal of Economics & Management Strategy* 24, 415–455.

- [27] Hellmann, T.F. (2002) "A theory of strategic venture investing," Journal of Financial Economics 64, 284–314.
- [28] Hellmann, T.F. (2006) "IPOs, acquisitions, and the use of convertible securities in venture capital," *Journal of Financial Economics* 81, 649–679.
- [29] Hellmann, T.F., Lindsey, L., Puri, M. (2008) "Building relationships early: Banks in venture capital," *The Review of Financial Studies* 21, 513–541.
- [30] Hellmann, T.F., Puri, M. (2000) "The interaction between product market and financing strategy: The role of venture capital," *The Review of Financial Studies* 13(4), 959–984.
- [31] Hellmann, T.F., Schure, P.H, Vo, D.H. (2017) "Angels and venture capitalists: Substitutes or complements?" W.P. Saïd Business School.
- [32] Hsu, D.H. (2004) "What do entrepreneurs pay for venture capital affiliation?," The Journal of Finance 59(4), 1805–1844.
- [33] Hsu, D.H. (2007) "Experienced entrepreneurial founders, organizational capital, and venture capital funding," *Research Policy* 36, 722–741.
- [34] Jensen, M.C., Meckling, W.H. (1976) "Theory of the firm: managerial behavior, agency costs and ownership structure," *Journal of Financial Economics* 3(4), 305– 360.
- [35] Kaplan, S.N., Lerner, J. (2016) "Venture capital data: Opportunities and challenges," Harvard Business School W.P.
- [36] Kaplan, S.N., Sensoy, B.A., Strömberg, P. (2009) "Should investors bet on the jockey or the horse? Evidence from the evolution of firms from early business plans to public companies," *The Journal of Finance* 64, 75–115.
- [37] Kerr, W.R., Lerner, J., Schoar, A. (2014) "The consequences of entrepreneurial finance: Evidence from angel financings," *The Review of Financial Studies* 27(1), 20–55.

- [38] Kim, J.Y., Park, H.D. (2017) "Two faces of early corporate venture capital funding: Promoting innovation and inhibiting IPOs" *Strategy Science* 2(3), 161–175.
- [39] Lee, P.M., Wahal, S. (2004) "Grandstanding, certification and the underpricing of venture capital backed IPOs," *Journal of Financial Economics* 73, 375–407.
- [40] Lerner, J. (1994) "The syndication of venture capital investments," Financial Management 23, 16–27.
- [41] Lerner, J., Schoar, A., Sokolinski, S., Wilson, K. (2018) "The globalization of angel investments: Evidence across countries," *Journal of Financial Economics* 127, 1–20.
- [42] Lindsey, L., Stein, L.C.D. (2018) "Angels, entrepreneurship, and employment dynamics: Evidence from investor accreditation rules," W.P. Arizona State University.
- [43] Maats, F., Metrick, A., Yasuda, A., Hinkes, B., Vershovski, S. (2011) "On the consistency and reliability of venture capital databases," unpublished W.P.
- [44] Mason, C.M., Harrison, R.T. (2008) "Measuring business angel investment activity in the United Kingdom: A review of potential data sources," *Venture Capital* 10, 309–330.
- [45] MacMillan, I.C., Siegel, R., Subba Narasimha, P.N. (1985) "Criteria used by venture capitalist to evaluate new venture proposals," *Journal of Business Venturing* 1, 119– 128.
- [46] Park, H.D., Steensma, H.K. (2012) "When does corporate venture capital add value for new ventures?" Strategic Management Journal 33(1), 1–22.
- [47] Pollock, T.G., Chen, G., Jackson, E.M., Hambrick, D.C. (2010) "How much prestige is enough? Assessing the value of multiple types of high-status affiliates for young firms," *Journal of Business Venturing* 25, 6–23.
- [48] Puri, M., Zarutskie, R. (2012) "On the lifecycle dynamics of venture-capital and non-venture-capital-financed firms," *The Journal of Finance* 67, 2247–2293.
- [49] Riyanto, Y.E., Schwienbacher, A. (2006) "The strategic use of corporate venture financing for securing demand," *Journal of Banking & Finance* 30, 2809–2833.

- [50] Roure, J.B., Madique, M.A. (1986) "Linking prefunding factors and high-technology venture success: An exploratory study," *Journal of Business Venturing* 1, 295–306.
- [51] Shane, S., Stuart, T. (2002) Organization endowments and the performance of university startups," *Management Science* 48, 154–170.
- [52] Sørensen, M. (2007) "How smart is smart money? A two-sided matching model of venture capital," *The Journal of Finance* 62, 2725–2762.
- [53] Van de Ven, A.H., Hudson, R., Schroeder, D.M. (1984) "Designing new business start ups: Entrepreneurial, organizational, and ecological considerations," *Journal of Management* 10, 87–108.
- [54] Wasserman, N. (2017) "The throne vs. the kingdom: Founder control and value creation in startups," *Strategic Management Journal* 38, 255–277.

Figure 1: Average ownership structure

This figure shows the percentage of ownership of founders, non-founding directors, other individual investors, VCs and Other prior to first-VC investment, at first VC investment and at exit for the average company.

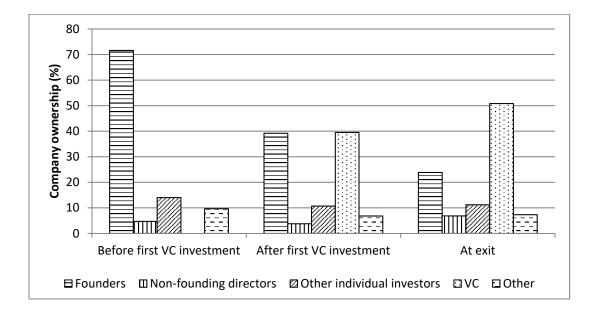
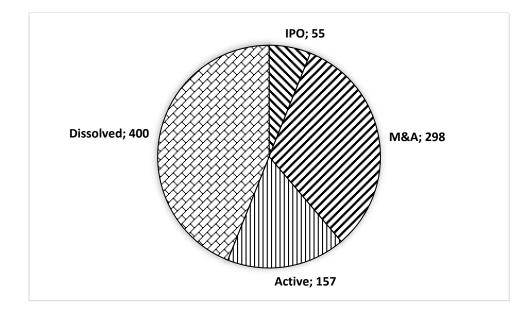


Figure 2: Company exit



This figure reports the number of start-ups by type of exit.

Figure 3A: Average Investment by Exit

This figure shows the cumulative investment prior to first-VC investment, at first VC investment and at exit for the average company that exits through an IPO, an M&A, remains active, has other type of exit, or ends up dissolved.

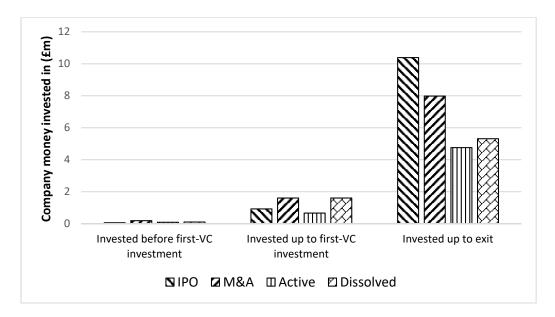


Figure 3B: Average valuation by exit

This figure shows the valuation prior to first-VC investment, at first VC investment and at exit for the average company that exits through an IPO, an M&A, remains active, has other type of exit, or ends up dissolved.

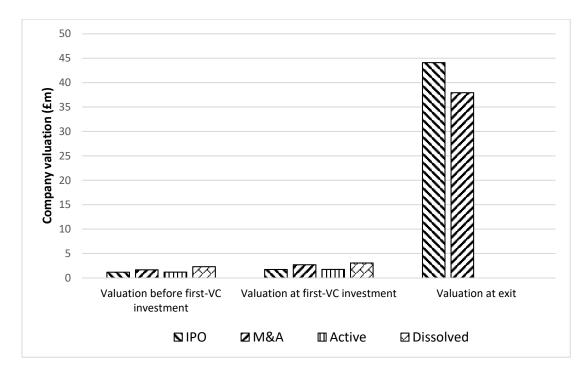


Table 1: Investors

Table 1 presents the importance of the different types of investor in our database. Panel A shows the number of unique investors and their total investment for each type and the percentage they represent of the total number of investors and the total investment. Panel B (resp. Panel C) summarises similar information about the different types of individuals (resp. institutional investors) in our database.

| Panel A | | | | | | | | |
|----------------------------|--------|------------|------------------|-----------------------------|--|--|--|--|
| Type of investors (unique) | Number | Doroontogo | Total investment | Percentage of investment | | | | |
| Type of investors (unique) | Number | Percentage | (£m) | | | | | |
| Individuals | 16,408 | 84.47% | 617 | 11.02% | | | | |
| Institutions | 2,051 | 10.56% | 4,552 | 81.25% | | | | |
| Unknown/Undisclosed | 966 | 4.97% | 433 | 7.73% | | | | |
| Total | 19,425 | 100.00% | 5,602 | 100.00% | | | | |

| Panel B | | | | | | | | |
|----------------------------|--------|------------|--------------------------|-----------------------------|--|--|--|--|
| Individuals (not unique) | Number | Percentage | Total investment (£m) | Percentage of investment | | | | |
| Founders | 2,465 | 9.89% | 158.927 | 25.74% | | | | |
| Non-Founding Directors | 8,670 | 34.80% | 119.849 | 19.42% | | | | |
| Other Individual Investors | 13,781 | 55.31% | 338.575 | 54.84% | | | | |
| Total | 24,916 | 100.00% | 617.351 | 100.00% | | | | |

| Panel C | | | | | | | | |
|----------------------------------|--------|------------|--------------------------|-----------------------------|--|--|--|--|
| Institutional Investors (unique) | Number | Percentage | Total investment (£m) | Percentage of investment | | | | |
| Independent VC | 1,188 | 57.92% | 3,924.605 | 86.22% | | | | |
| Corporate VC | 86 | 4.20% | 331.787 | 7.29% | | | | |
| Corporate Venture Investment | 602 | 29.35% | 196.183 | 4.31% | | | | |
| Organisation VC | 38 | 1.85% | 57.346 | 1.26% | | | | |
| Other Instutional Investors | 137 | 6.68% | 41.891 | 0.92% | | | | |
| Total | 2,051 | 100.00% | 4,551.812 | 100.00% | | | | |

Table 2: Comparison of the exit routes according to VentureXpert with the actual exit routes

This table shows the comparison between the exits found by VX (taken from the VX variable "Company Status") and the ones we found by displaying how many companies were classified in each category, both by VX and us. The rows show our classification and the columns show the VX classification. The M&A category for VX includes: "Acquisition," "Pending Acquisition," "Merger" and "LBO." The Active category for our classification includes: "Active," "MBO/MBI" and "Repurchase."

| Startup Exit | Active | M&A | IPO | Dissolved | Total |
|--------------|--------|-----|-----|-----------|-------|
| Active | 124 | 28 | 0 | 5 | 157 |
| M&A | 87 | 202 | 1 | 8 | 298 |
| IPO | 11 | 11 | 33 | 0 | 55 |
| Dissolved | 287 | 51 | 2 | 60 | 400 |
| Total | 509 | 292 | 36 | 73 | 910 |

Table 3: Comparison of coverage of institutional investors by VentureXpert and our database

This table shows the comparison of our data with that of VX regarding institutional investors. Panel A compares the magnitudes for each type of institutional investor, both in terms of number of investors and total investment in the startups of our sample. The "Investment" columns show the total investment of each type of investor across our sample, both according to our database and to VX. The "VX Coverage" column shows the percentage ratio between the last two. Panel B compares, for each startup, the investment magnitude found in VX with the one we have found for every type of institutional investor, and shows whether there is a match, an overestimation or an underestimation by VX. We allowed a ±20% error margin. The results are presented in number of companies and in percentage.

| Panel A | | | | | | |
|-----------------|-------|--------|-------------|----------|-----------------|-------------|
| | | Number | | | Investment (£m) | |
| | Ours | VX | VX Coverage | Ours | VX | VX Coverage |
| Independent VC | 1,188 | 416 | 35.02% | 3,924.61 | 3,982.45 | 101.47% |
| Corporate VC | 86 | 54 | 62.79% | 331.79 | 327.22 | 98.62% |
| Organisation VC | 38 | 10 | 26.32% | 57.35 | 34.18 | 59.60% |

| Panel B* | | | | | | | |
|-----------------|-------|----------------|--------------|---------------|---------|-----------------|----------------|
| | Match | Ours is higher | VX is higher | Not investing | % Match | % Underestimate | % Overestimate |
| Independent VC | 244 | 178 | 287 | 19 | 34.41% | 25.11% | 40.48% |
| Corporate VC | 66 | 15 | 39 | 608 | 55.00% | 12.50% | 32.50% |
| Organisation VC | 66 | 7 | 13 | 642 | 76.74% | 8.14% | 15.12% |
| All investors | 188 | 190 | 350 | | 25.82% | 26.10% | 48.08% |

*182 companies were not used due to lack of data; therefore N is 728

Table 4: List of variables

In this table, we report the variables we use in the regressions and their definition.

| Name of variable | Definition of variable |
|--|---|
| Num Members Founding Team | # of individuals who are founding directors |
| Presence Founder with Experience in Directing | dummy equal to 1 if at least a founding director has previous experience as director |
| Num Early Non-Founding Directors | |
| , - | # of individuals who are directors before first VC but who are not founding directors |
| Presence Experienced Early Non-Founding Director | dummy equal to 1 if at least a non-founding director has previous experience as director # of individual investors who are not founders or directors before first VC |
| Num Other Early Individual Investors | |
| Presence Early Business Angel | dummy equal to 1 if at least an early investor is a seasoned investor |
| Start-Up Age at First VC (years) | difference between date of first VC and date of incorporation (in years) |
| Money Inv Before First VC (logs) | log of the total amount invested before first VC |
| Presence Early Research Institution | dummy equal to 1 if at least a research institution is present before first VC |
| Presence IVC at First VC | dummy equal to 1 if at least an IVC invests at first VC |
| Presence CVC at First VC | dummy equal to 1 if at least a CVC invests at first VC |
| Presence CVI at First VC | dummy equal to 1 if at least an CVI invests at first VC |
| Presence OVC at First VC | dummy equal to 1 if at least an OVC invests at first VC |
| Presence Top IVC at First VC | dummy equal to 1 if at least a top IVC investment at first VC |
| Num VCs at First VC | # of VCs investing at first VC |
| VC Money Inv at First VC (logs) | log of the total amount invested by VCs at first VC |
| % Ownership by VCs at First VC | percentage of ownership taken by all the VCs at first VC |
| VC Director App at First VC | dummy equal to 1 if a new director is appointed at first VC |
| Success | dummy equal to 1 if the company exists through IPO or M&A |
| IPO | dummy equal to 1 if the company exists through IPO |
| M&A | dummy equal to 1 if the company exists through M&A |
| Valuation at Year 3 (logs) | log of market value of common shares plus nominal value of preferred shares 3 years after first VC |
| Valuation at Year 5 (logs) | log of market value of common shares plus nominal value of preferred shares 5 years after first VC |
| Final Valuation (logs) | log of the company valuation at exit date |

Table 5: Descriptive Statistics

In this table, we report the descriptive statistics for the dependent and independent variables that we use in the regressions of this paper. All variables are defined in Table 4.

| | (1) | (2) | (3) | (4) | (5) | (6) |
|--|-----|-------|--------|-------|------|--------|
| Variables | N | mean | median | sd | min | max |
| | | | | | | |
| Num Members Founding Team | 910 | 2.71 | 2 | 1.59 | 0 | 10 |
| Presence Founder with Experience in Directing | 910 | 0.11 | 0 | 0.31 | 0 | 1 |
| Num Early Non-Founding Directors | 910 | 0.96 | 0 | 1.62 | 0 | 17 |
| Presence Experienced Early Non-Founding Director | 910 | 0.07 | 0 | 0.26 | 0 | 1 |
| Num Other Early Individual Investors | 910 | 2.52 | 1 | 4.92 | 0 | 58 |
| Presence Early Business Angel | 910 | 0.12 | 0 | 0.33 | 0 | 1 |
| Start-Up Age at First VC (years) | 910 | 1.52 | 0.87 | 1.73 | 0 | 10.54 |
| Money Inv Before First VC (£m) | 910 | 0.12 | 0.00 | 0.78 | 0 | 15.85 |
| Presence Early Research Institution | 910 | 0.11 | 0 | 0.31 | 0 | 1 |
| Presence IVC at First VC | 910 | 0.82 | 1 | 0.38 | 0 | 1 |
| Presence CVC at First VC | 910 | 0.06 | 0 | 0.25 | 0 | 1 |
| Presence CVI at First VC | 910 | 0.24 | 0 | 0.42 | 0 | 1 |
| Presence OVC at First VC | 910 | 0.06 | 0 | 0.23 | 0 | 1 |
| Presence Top IVC at First VC | 910 | 0.37 | 0 | 0.48 | 0 | 1 |
| Num VCs at First VC | 910 | 1.63 | 1 | 1.18 | 1 | 13 |
| VC Money at First VC (£m) | 645 | 1.15 | 0.31 | 4.40 | 0.01 | 103.06 |
| % Ownership by VCs at First VC | 910 | 39.59 | 30.77 | 31.04 | 0.00 | 100.00 |
| VC Director Appointed at First VC | 910 | 0.48 | 0 | 0.50 | 0 | 1 |
| Success | 910 | 0.39 | 0 | 0.49 | 0 | 1 |
| IPO | 910 | 0.06 | 0 | 0.24 | 0 | 1 |
| M&A | 910 | 0.33 | 0 | 0.47 | 0 | 1 |
| Valuation at Year 3 (£m) | 722 | 6.67 | 1.33 | 23.70 | 0 | 434.61 |
| Valuation at Year 5 (£m) | 679 | 7.97 | 0.84 | 26.63 | 0 | 434.61 |
| Final Valuation (£m) | 590 | 12.70 | 0 | 39.28 | 0 | 434.61 |

Table 6: Correlations

This table shows correlations between some of the variables that we use in the regressions. ***, **, and * indicate significance at the 1%, 5%, and 10% level, respectively.

| Panel A | | |
|--------------------------------------|---------------------------|----------------------------------|
| | Num Members Founding Team | Num Early Non-Founding Directors |
| Num Early Non-Founding Directors | -0.17*** | |
| Num Other Early Individual Investors | 0.13*** | 0.08** |

| Panel B | | | | | | |
|------------------------------|--------------------------|--------------------------|--------------------------|--------------------------|--|--|
| | Presence IVC at First VC | Presence CVC at First VC | Presence CVI at First VC | Presence OVC at First VC | | |
| Presence CVC at First VC | -0.16*** | | | | | |
| Presence CVI at First VC | -0.53*** | -0.10*** | | | | |
| Presence OVC at First VC | -0.18*** | -0.03 | -0.02 | | | |
| Presence Top IVC at First VC | 0.35*** | 0.00 | -0.18*** | 0.00 | | |

| Panel C | | | | | | |
|--------------------------------------|------------------------------|--------------------------|--------------------------|---------------------|--|--|
| | Presence Top IVC at First VC | Presence CVC at First VC | Presence CVI at First VC | Num VCs at First VC | | |
| Num Members Founding Team | 0.13*** | 0.01 | -0.08** | 0.02 | | |
| Num Early Non-Founding Directors | 0.04 | 0.06* | 0.02 | 0.08** | | |
| Num Other Early Individual Investors | 0.05 | 0.02 | 0.03 | 0.16*** | | |

| Panel D | | | |
|--------------------------------------|---------|---------|----------|
| | Success | IPO | M&A |
| Num Members Founding Team | 0.10*** | -0.02 | 0.11*** |
| Num Early Non-Founding Directors | 0.08** | -0.01 | 0.09*** |
| Num Other Early Individual Investors | 0.03 | 0.00 | 0.03 |
| Start-Up Age at First VC (years) | 0.07** | -0.02 | 0.09*** |
| Money Inv Before First VC (£m) | 0.04 | -0.02 | 0.05 |
| Presence Early Research Institution | -0.05 | 0.00 | -0.06* |
| Presence IVC at First VC | 0.09*** | 0.00 | 0.09*** |
| Presence CVC at First VC | -0.04 | -0.01 | -0.03 |
| Presence CVI at First VC | -0.07** | 0.03 | -0.09*** |
| Presence OVC at First VC | -0.07** | 0.00 | -0.07** |
| Presence Top IVC at First VC | 0.07** | -0.08** | 0.12*** |
| Num VCs at First VC | -0.03 | 0.01 | -0.04 |
| VC Money Inv at First VC (£m) | 0.00 | -0.02 | 0.02 |
| % Ownership by VCs at First VC | 0.01 | -0.05 | 0.03 |
| VC Director Appointed at First VC | 0.08** | -0.01 | 0.09*** |

Table 7: Effects of pre-institutional features on first VC investment

This table shows the effects of the characteristics of the start-up in its early stage, i.e., at the stage prior to the VC, on the first-VC investment. The set of independent variables includes the number of members of the founding team, early non-founding directors, and early investors, dummy variables indicating the presence of an experienced individual in those cathegories, as well a dummy variable indicating the presence of a reserach institution before first-VC investment. Other independent variables are the start-up age at the first-VC investment and the logarithm of the amount invested before the first-VC investment. As for dependent variables, "Presence IVC/CVC/CVI/OVC/top IVC at First VC" (columns 1-5) are dummy variables that indicate whether this type of VC is investing in the first-VC investment. Column 6 states the effect on the number of VCs. "VC Director App at First VC" is a dummy variable that indicates whether a director was appointed at the time of the first-VC investment (column 7). The variable "% Ownership by VCs at First VC" is the percentage of ownership taken by all the VCs in a start-up at the moment of the first-VC investment (column 8). Lastly, the variable "VC Money Inv at First VC" measures the VC investment at the time of first-VC investment and it is regressed in column 9. All the regressions control for location and industry-year. We cluster the standard errors at the industry level. Dummy variables were regressed using a maximum likelihood probit model, while numerical variables were regressed using a robust OLS. ***, **, and * indicate significance at the 1%, 5%, and 10% level, respectively.

| | (1) | (2) | (3) | (4) | (5) | (6) | (7) | (8) | (9) |
|--|--------------|--------------|--------------|--------------|-----------------|---------------|-----------------|--------------|--------------|
| VARIABLES | Presence IVC | Presence CVC | Presence CVI | Presence OVC | Presence Top | Number VCs at | VC Director | VC Ownership | VC Money Inv |
| | at First VC | at First VC | at First VC | at First VC | IVC at First VC | First VC | App at First VC | at First VC | at First VC |
| | | | | | | | | | |
| Num Members Founding Team | 0.096*** | 0.040 | -0.086*** | -0.082*** | 0.092* | 0.017 | -0.027** | -1.923* | 0.054 |
| | [0.005] | [0.074] | [0.021] | [0.032] | [0.051] | [0.040] | [0.011] | [0.551] | [0.056] |
| Presence Founder with Experience in Directing | -0.128 | -0.035 | 0.191*** | -0.059 | 0.095 | -0.010 | -0.308*** | 0.169 | -0.231 |
| | [0.172] | [0.178] | [0.039] | [0.195] | [0.155] | [0.135] | [0.065] | [4.775] | [0.192] |
| Num Early Non-Founding Directors | 0.059** | 0.159** | 0.064*** | -0.377*** | 0.019 | 0.100* | -0.081*** | 2.504* | 0.202* |
| | [0.028] | [0.066] | [0.020] | [0.120] | [0.053] | [0.033] | [0.023] | [0.766] | [0.058] |
| Presence Experienced Early Non-Founding Director | 0.252* | -0.788* | -0.359** | 0.626*** | 0.300** | -0.234 | -0.143 | 1.391 | -0.103 |
| | [0.151] | [0.431] | [0.162] | [0.239] | [0.124] | [0.201] | [0.263] | [4.175] | [0.168] |
| Num Other Early Individual Investors | -0.014** | 0.014*** | 0.008 | 0.006 | 0.005 | 0.034** | -0.002 | -0.569** | 0.019 |
| | [0.006] | [0.003] | [0.007] | [0.011] | [0.012] | [0.007] | [0.007] | [0.110] | [0.007] |
| Presence Early Business Angel | 0.151*** | -0.300*** | 0.127*** | 0.497** | -0.029 | 0.162** | 0.138 | -0.104 | -0.072 |
| | [0.049] | [0.068] | [0.030] | [0.205] | [0.238] | [0.035] | [0.100] | [1.316] | [0.139] |
| Presence Early Research Institution | -0.033 | 0.296 | -0.114 | 0.777*** | -0.016 | 0.104 | 0.229** | -14.020** | -0.231 |
| | [0.169] | [0.202] | [0.086] | [0.239] | [0.249] | [0.214] | [0.093] | [2.705] | [0.210] |
| Start-Up Age at First VC Investment (years) | 0.134*** | -0.031 | -0.201*** | 0.014 | -0.002 | -0.053 | 0.031 | -3.111* | 0.040 |
| | [0.016] | [0.070] | [0.018] | [0.065] | [0.012] | [0.032] | [0.044] | [0.783] | [0.055] |
| Money Inv Before First VC (logs) | -0.029* | -0.040 | 0.014 | -0.017 | 0.047*** | -0.027 | -0.017 | -2.891** | 0.027 |
| | [0.016] | [0.068] | [0.026] | [0.024] | [0.005] | [0.018] | [0.019] | [0.454] | [0.025] |
| Controls | YES | YES | YES | YES | YES | YES | YES | YES | YES |
| Constant | -0.233 | -1.888** | 0.300 | -2.185*** | -0.743*** | 1.642** | 0.019 | 30.949*** | -0.735 |
| | [0.149] | [0.806] | [0.270] | [0.372] | [0.150] | [0.226] | [0.268] | [2.919] | [0.584] |
| Observations | 902 | 734 | 900 | 793 | 908 | 910 | 910 | 910 | 645 |
| R-squared | | | | | | 0.088 | | 0.171 | 0.140 |

Robust standard errors in brackets

Table 8: Effects of pre-institutional features and first-VC investment on exit and valuation

This table shows the effect of both the early stage and the first VC investment on several measures of the performance of the startup.Column 1 considers the likelihood of a successful exit, understood as an IPO or an M&A, as opposed to any other exit route. Columns 2 and 3 (as well as columns 4 and 5) show the results of a multilogit model on the likelihood of an IPO or an M&A exit, understood as an IPO or M&A as opposed to any other exit route. Columns 6 and 7 show the results of a probit model on the likelihood of an IPO in the the set successful exit. Finally, columns 8 to 10 report the results of OLS regressions on the valuation of the startup 3 and 5 years after after the first-VC investment, as well as on the final valuation.All the regressions control for location and industry-year. We cluster the standard errors at the industry level. Dummy variables were regressed using a maximum likelihood probit or multilogit model, while numerical variables were regressed using a robust OLS. ***, **, and * indicate significance at the 1%, 5%, and 10% level, respectively.

| | (1) | (2) | (3) | (4) | (5) | (6) | (7) | (8) | (9) | (10) | (11) |
|--|---------------------|---------------------|----------------------|----------------------|----------------------|----------------------|----------------------|----------------------|------------------------|------------------------|--------------------|
| VARIABLES | Success | Success | IPO | M&A | IPO | M&A | IPO vs M&A | IPO vs M&A | Valuation at Year 3 | Valuation at Year 5 | Final Valuation |
| | | 0 000*** | | | | | | | | | |
| Num Members Founding Team | 0.090*** | 0.089*** | -0.017 | 0.179*** | 0.012 | 0.174*** | -0.117*** | -0.084*** | 0.094 | 0.249** | 0.371** |
| | [0.022] | [0.019] | [0.017] | [0.036] | [0.032] | [0.039] | [0.038] | [0.032] | [0.050] | [0.051] | [0.059] |
| Presence Founder with Experience in Directing | 0.212 | 0.178 | 0.638 | 0.258* | 0.721 | 0.229* | 0.088 | 0.125 | 0.493 | 0.797* | 1.131 |
| Num Early Non-Founding Directors | [0.147] | [0.151] 0.088*** | [0.517] | [0.141] | [0.574] | [0.136] | [0.444] | [0.486] | [0.343] | [0.195] | [0.959] |
| | 0.093*** | [0.009] | 0.019 | 0.181*** | 0.023 | 0.189*** | -0.131 | -0.151 | 0.244** | 0.296** | 0.313 |
| Descence Function and Factor M. S. M. Di | [0.018] | -0.056 | [0.155] | [0.024] | [0.133] | [0.023] | [0.114] | [0.105] | [0.032] | [0.047] | [0.163] |
| Presence Experienced Early Non-Founding Director | -0.089 | [0.212] | 0.631 | -0.382** | 0.786 | -0.430*** | 0.396 | 0.459 | -0.293 | -0.263 | -0.124 |
| Nume Othern Franks to dividual towards are | [0.260] | -0.005 | [1.339] | [0.158] | [1.332] | [0.154] | [0.751] | [0.764] | [0.278] | [0.386] | [0.634] |
| Num Other Early Individual Investors | -0.003 | [0.005] | 0.021** | -0.009 | 0.014** | -0.011 | 0.018*** | 0.020*** | -0.016 | -0.012 | -0.010 |
| Durana a Fasha Durain ang Asiant | [0.008] 0.174*** | 0.186*** | [0.009] -0.501** | [0.014] 0.424*** | [0.006] -0.537* | [0.013] 0.444*** | [0.005] -0.603*** | [0.007] -0.625** | [0.015] 0.601** | [0.031] | [0.037] |
| Presence Early Business Angel | | [0.048] | | | | | | | | 0.682 | 0.727* |
| Dressnes Farly Desserte Institution | [0.051] | -0.502*** | [0.201] | [0.096] -0.878*** | [0.299] | [0.094] -0.900*** | [0.189] | [0.249] | [0.077] | [0.255] | [0.221] |
| Presence Early Research Institution | -0.485** | [0.153] | -0.442 | | -0.429 | | 0.613** | 0.641** | 0.336 | -0.047 | -1.706* |
| Start Lin Ago at Eirst VC Investment (vears) | [0.197] 0.049 | 0.060 | [0.700] -0.229*** | [0.304] 0.144* | [0.582] -0.216*** | [0.301] 0.150** | [0.284] -0.173*** | [0.254] -0.194*** | [0.296] -0.229* | [0.664] -0.248* | [0.405] -0.001 |
| Start-Up Age at First VC Investment (years) | [0.044] | [0.041] | [0.076] | [0.075] | [0.073] | [0.075] | [0.061] | [0.052] | [0.054] | [0.070] | [0.252] |
| Money Inv Before First VC (logs) | 0.001 | -0.005 | -0.035 | 0.003 | -0.022 | -0.004 | -0.059 | -0.052 | -0.013 | 0.044 | -0.016 |
| | [0.013] | [0.017] | [0.044] | [0.022] | [0.046] | [0.021] | [0.044] | [0.047] | [0.048] | [0.055] | [0.058] |
| Presence IVC at First VC | 0.208*** | [0.017] | 0.993* | 0.221*** | [0.040] | [0.021] | 0.432 | [0.047] | -0.148 | 0.339 | 0.459 |
| | [0.061] | | [0.532] | [0.069] | | | [0.451] | | [0.341] | [0.354] | [0.646] |
| Presence CVC at First VC | -0.224** | | 0.037 | -0.459*** | -0.615 | -0.503*** | 0.727 | 0.482 | -0.170 | 0.763 | 0.073 |
| | [0.098] | | [0.988] | [0.029] | [0.725] | [0.049] | [0.978] | [0.819] | [0.273] | [0.505] | [0.683] |
| Presence CVI at First VC | -0.025 | | 0.579 | -0.170 | -0.163 | -0.218** | 0.416 | 0.238 | 0.285 | 0.496 | 0.324 |
| | [0.094] | | [0.575] | [0.130] | [0.447] | [0.109] | [0.310] | [0.175] | [0.261] | [0.302] | [0.591] |
| Presence OVC at First VC | -0.118 | | 0.251 | -0.259 | -0.233 | -0.318 | 0.459 | 0.465 | 0.069 | 0.310* | 0.822 |
| | [0.128] | | [0.282] | [0.303] | [0.501] | [0.295] | [0.496] | [0.534] | [0.359] | [0.085] | [1.122] |
| Presence Top IVC at First VC | [0.120] | | [0.202] | [0.505] | -0.727 | 0.331*** | [0.150] | -0.602** | [0.555] | [0.005] | [1.122] |
| | | | | | [0.635] | [0.087] | | [0.297] | | | |
| Num VCs at First VC | -0.069** | | 0.008 | -0.141** | 0.181** | -0.146** | 0.103 | 0.140* | -0.156* | -0.230*** | -0.200 |
| | [0.035] | | [0.099] | [0.057] | [0.076] | [0.071] | [0.100] | [0.073] | [0.039] | [0.014] | [0.074] |
| % Ownership by VCs at First VC | -0.000 | | -0.010*** | 0.002 | -0.008** | 0.001 | -0.005** | -0.003 | -0.006 | -0.000 | -0.007* |
| ······································ | [0.000] | | [0.003] | [0.001] | [0.003] | [0.001] | [0.003] | [0.002] | [0.007] | [0.010] | [0.002] |
| VC Money at First VC (logs) | 0.054** | | -0.018 | 0.100** | 0.039 | 0.075* | -0.106** | -0.065 | 0.108 | 0.067 | 0.202 |
| | [0.027] | | [0.069] | [0.039] | [0.078] | [0.040] | [0.042] | [0.045] | [0.089] | [0.028] | [0.119] |
| VC Director App at First VC | 0.237*** | | 0.262 | 0.439*** | 0.259 | 0.430*** | -0.122 | -0.132 | 0.660*** | 0.807* | 1.001 |
| | [0.050] | | [0.323] | [0.070] | [0.326] | [0.082] | [0.118] | [0.109] | [0.033] | [0.274] | [0.682] |
| Controls | YES | YES | YES | YES | YES | YES | YES | YES | YES | YES | YES |
| Constant | -1.163*** | -1.030*** | -2.084*** | -2.695*** | -1.264*** | -2.649*** | 0.102 | 0.305 | -1.380 | -3.050 | -6.044*** |
| | [0.074] | [0.084] | [0.176] | [0.074] | [0.197] | [0.030] | [0.405] | [0.473] | [0.906] | [1.052] | [0.387] |
| Observations | 908 | 908 | 910 | 910 | 910 | 910 | 317 | 317 | 722 | 679 | 590 |
| R-squared | | | | | | | | | 0.102 | 0.123 | 0.123 |

Standard errors in brackets