

# **Socioeconomic Networks: In Search of Better Support for University Spin-offs**

Danny P Soetanto  
Marina van Geenhuizen  
Faculty of Technology, Policy and Management  
Delft University of Technology  
PO Box 5015, 2600 GA Delft, The Netherlands  
Contact: d.p.soetanto@tbn.tudelft.nl

## **Abstract**

*In this paper, we explore factors that may determine the performance of university spin-off companies. In particular, we focus on socioeconomic networks and support received from incubator organizations. Using spin-offs from the Technical University of Delft, the Netherlands as a case study, we explore whether spin-offs' performance is influenced by the characteristics of their networks, i.e. tightness, strength of relationships, heterogeneity in partners' background and spatial proximity. With regard to support from incubator organizations, we distinguish between conventional and added value support and explore whether spin-offs perform better if they receive both types of support compared with only conventional support. The results of the regression analysis confirm that loose networks and weak relationships are enhancing spin-offs' growth. It was also confirmed that interaction with partners of diverse backgrounds enhances growth, while a positive influence of close geographical proximity with network partners was not confirmed. In addition, the results confirmed the idea that receiving a combination of conventional and added value support has a more positive influence on spin-offs' growth than receiving only conventional support. Overall, network characteristics tend to influence growth much stronger than various support measures.*

**Keywords:** *university spin-offs, resources, network, regression analysis, TU Delft (The Netherlands).*

## 1. Introduction

Over the last two decades, there has been an increased attention for the contribution of universities and other public research institutions to the creation of new ventures. University spin-offs (USOs) transfer scientific and technological knowledge from universities to the market place (Chiesa and Piccaluga, 2001). University spin-offs may appear small in terms of aggregate employment, but they significantly contribute to the creation of new jobs and innovation of the regional economy (Rothwell and Zegveld, 1985, Mansfield, 1991). Having new technology as the core of their business and provided that they are clustered in space, these firms increase the competitive edge of regions (e.g. Keeble and Wilkinson, 1999). In more detail, USOs offer benefits such as:

- To promote technological entrepreneurship in regions as they base their business mostly on high technology development, rely on high-tech skills, and pay good wages.
- To stimulate other business support and infrastructures that in turn provide benefits to other start ups (Lockett *et al.* 2003).
- In the context of the university, to strengthen the relationships with the business community, improve the image of universities, fulfill commitment to society, and generate income from patents (e.g. Heydebreck *et al.*, 2002)

Over the years, these advantages have been widely recognized and fostering spin-offs has become part of most universities' and research centers' policy to commercialize research results. Among the many ways to accelerate the growth of USOs, perhaps the most captivating one is establishing incubator organizations. The infrastructure of incubators was built gradually in industrial countries such as the United States and Western Europe in the last two decades. Incubators have evolved and now appear to reach maturity (Lalkaka, 2001). The first generation of incubators in the 1980s essentially only offered affordable office facilities to potential new firms. As time progressed, it was realized that the needs of spin-offs include more than just physical support (e.g. office and administrative support) and financial support. This situation has challenged various incubators to respond to the necessity of providing "value added support", like business skills training and connecting the entrepreneur with different networks.

However, after several years of spin-offs euphoria, some studies have started to look critically at the entrepreneurial output of universities. A recent study points out that even though some successful spin-out companies have been created, the mechanism has been overemphasized and it is still doubted that spin-offs will survive in the long term (Lambert, 2003). Other studies have also examined the impact and high transaction cost of spinning out in a critical way (Bozeman, 2000; Lerner, 2005). In spite of these critics, the creation of university spin-offs still represents a potentially important innovation mechanism for academia (Vohora *et al.* 2004). It seems necessary to shift the support policy to the creation of better performing spin-offs. This means focusing on the quality of spin-offs instead of the quantity (Clarysee *et al.*, 2004). Consequently, incubator organizations need to reconsider their support.

We look at the growth of USOs as a process in which USOs try to acquire vital resources for their survival. However, in reality resources available to USOs are often not sufficient. Some USOs receive support from incubator organizations even though not all resources can be covered, while other USOs have to strive for acquiring resources on their own. Thus, the chance to grow depends critically on the environment of spin-offs and on the nature of the interaction with 'external partners' including friends, family, colleagues, and former lecturers or professors that provide access to important resources (Birley, 1985). In this respect,

networks as an essential factor influencing the survival of USOs should receive considerable thought from incubator organizations. Unfortunately, little attention has been paid to ways to improve the network structures of USOs. Although networking is seen by various authors as a key feature in explaining the nature of newly established firms and in predicting their future success (Larson and Starr, 1993), very few studies (except for Perez and Sanchez, 2003) focus on the early years of USOs' networks development. Moreover, with some exceptions (e.g. Nicolaou and Birley, 2003) relatively few empirical studies have attempted to use statistical analysis. Most research on USOs' networks draws on case studies. Thus, so far the influence of socioeconomic networks that may determine early growth of spin-offs are still unexplored by using large and medium scale surveys (Markman *et al.*, 2005).

This study is undertaken in response to the lack of attention given to factors underlying the growth of USOs. We address the following question, what are the influence different socioeconomic networks and different support received from incubator organization on the growth of USOs? Following Cooper (1992), our approach uses multi-factors as a predictor for firm performance, instead of focusing only on one particular factor, because the former approach is more comprehensive in predicting the USOs' performance. Accordingly, we develop a causal model and test this model by applying regression analysis. The paper is presented in the following structure. First, we provide a brief overview of Resource-Based theory followed by the development of hypotheses. In the next section, the research design is discussed. The regression results and evaluation of these results follow in the section. The paper ends with brief discussion of policy implications.

## **2. Theoretical Background: Resource-Based Theory**

In general, to understand factors that explain the growth of firms, scholars have developed various theoretical viewpoints, including knowledge-based theory, the dynamic capability perspective, business networks, and strategic alliances. Basically, all of these approaches are rooted in the Resource Based View (RBV) introduced by Penrose (1959). Penrose's seminal work has been instrumental to the on-going development of modern resource-based theory that is applied in many fields such as strategic management, organization studies and marketing.

According to the RBV, firms are conceptualized as heterogeneous bundles of assets or resources tied to the firms' management. Firms acquire or search for resources as an input and convert these into products or services for which revenue can be obtained. The resource based view suggests that heterogeneity of resources is necessary but not sufficient for a sustainable advantage. It suggests that resources have to be unique to firms in order to create competitive advantage. Resources should also be difficult to imitate, otherwise, competitors can easily obtain these resources and neutralize the competitive advantage (Barney, 1991).

In reality, firms frequently lack critical resources during their early development. Apart from the lack of *basic resources* such as initial investment and office facilities, new and small firms may also desire what are called *added value resources* such as the ability to identify business opportunities, learning to manage the firm, business guidance or advice, and mental endorsement. Such resources can be acquired; e.g. through the networks of these firms (Pisano, 1990).

Organizations, whether established firms or start-ups, are part of a network and are dependent on external actors (Pfeffer and Salancik, 1978). Studies on small firm growth indicate that

developed networks of strong relationships with various partners may be an advantage to gain resources (Hoang and Antoncic, 2003). Networks provide entrepreneurs with avenues for negotiation and persuasion, enabling them to gather a variety of resources (e.g., market information, problem solving, social support, venture funding, and other financial resources) held by other actors (Nicolaou and Birley, 2003). Birley (1985) observes the extensive use of social networks in the early stages of a venture generation process. Starr and MacMillan (1990) document the use of social and economic exchange mechanisms to acquire resources and to gain legitimacy during the early stages of ventures.

The literature (e.g. Birley, 1985) tends to distinguish between two types of networks on which firms can draw: formal and informal. Formal networks include financial institutions, accountants, lawyers, the chamber of commerce, small business administrators, etc. These are the people/institution who are directly connected with business matters. Informal networks may include family, friends, previous colleagues or previous employers, and former professors or lecturers. Conversations with them may range from hobby, family to business. Some of the relationships have been established long before entrepreneur launched their business. However, such networks are not static but dynamic from time to time. For instance, informal networks with friends may become formal ones when friends turn into customers. Moreover, there is no clear boundary between formal and informal. A person can be a tax consultant and friend at the same time.

In this study networks are defined as a socioeconomic network of important '*partners*' that potentially provide valuable resources for firm growth. As USOs frequently lack critical resources during their early development, especially entrepreneurial knowledge and skills (Geenhuizen and Soetanto, 2003). Accordingly, USOs may attempt to manage obstacles by seeking a solution through their '*partners*' (e.g. friends, colleagues, former professor, etc). These relationships with '*partners*' are may be essential in order to gather relevant knowledge, to get external support and service, to access external resources not available in-house, and to look for business advice (Birley, 1985). Thus, in the early years of USOs' establishment, socioeconomic networks may be important and cannot be neglected.

Another possibility for gaining resources is through incubator organizations. As an *organization*, incubators aim to accelerate the development of start-ups by providing an array of targeted resources and services. Incubators traditionally merge the concept of fostering new business development with the concept of technology transfer and commercialization (Phillips, 2002). They can be seen as entrepreneurial (non-profit) organizations in performing a bridging function between promising spin-offs and resources required by these spin-offs while protecting them against any potential failure (Hackett and Dilts, 2004). Incubators may also act as a link between start-ups and other partners that provide resources, such as venture capitalists, governments, financial institutions, and other business practitioners. In fact, incubators perform as a mechanism for a wide range of networking while encouraging the development of small businesses.

Many incubators employ large buildings, in which they offer customized rooms and supporting services. However, there are also examples of decentralized facilities, e.g. rooms spreading over different faculty buildings of universities. Generally, incubators support start-ups only on a temporary basis, e.g. three or four years, after which the start-ups are forced to leave the incubator and support will end. Some incubator organizations also try to provide access to business networks such as trade organizations. USOs can make use of these types of

support below market price, and thus they enjoy a cost reduction and enhance their competitive advantage.

### **3. Model Development and Hypotheses**

The central proposition of resource-based theory is that a firm has to build on and maintain their set of resources in order to survive and stay competitive. As the resources do not reside exclusively within firms, we argue that there are two ways that USOs can use to gain their resources that are through (1) socio-economic network and (2) incubators' support. The following sections will discuss each of the two factors and will present various hypotheses built base on them.

#### **3.1 Socioeconomic Network**

Although many empirical studies have proven benefits of socioeconomic networks for firm growth, little is known about the mechanism or structures inside socioeconomic networks between USOs and their partners. In reality, not all firms possess comparable levels of network resources. Firms' socioeconomic networks vary in terms of structure, pattern of relationship, and the variation in the mix of contacts. Therefore, the first part of our model serves to investigate the contribution of this factor in USOs' growth. In our study socioeconomic networks are examined by focusing on network characteristics: structural, strength of relationship, social, and spatial characteristics. The structural dimension refers to the degree of tightness among partner networks of USOs. The strength of relationship refers to the length of time and emotion invested on relationships. A social characteristic refers to the difference of social status among partners in networks. A spatial characteristic refers to the geographical location of partners.

##### **3.1.1 Structural Characteristics: Tight or Loose Networks**

In the literature of small business development, the importance of dense or tight networks is emphasized as being one of the factors influencing the survival of new and small firms. Tight networks are described as networks where everyone is connected to each other. Because people know and interact with each other, they are more likely to convey and reinforce norms of exchange and more easily able to monitor their observance and enforce sanctions. In business, such networks will reduce risk and enhance the opportunity to build cooperation and get access to resources from other people connected in the network. People on this kind of network are familiar with each other's interest, making the transfer of knowledge less difficult. They also build trust and credibility on each other. Therefore, tight networks are beneficial for the transfer of complex and tacit knowledge, development of trust and comfort, legitimacy or reputation, and joint problem solving (Coleman, 1990; Uzzi, 1996).

In contrast with the above argument, Grannovetter (1992) suggests that people who are connected in sparsely networks will enjoy more advantages. Accordingly, a loose networks structure causes benefits from the diversity of information and the brokerage opportunities created by the lack of connection between separate clusters in social networks. This leads into a concept called *Structural Hole* Theory (by Burt, 1992). The persons who occupy brokerage positions between those clusters have better access to information. Structural holes separate non redundant sources of information, sources that are more additive than overlapping. By being connected in a network which is rich of new information and opportunities, entrepreneurs have benefits in terms of : (1) enhancing business opportunities, (2) getting access to resources that could not otherwise be obtained, which often constitute the linking

knot between seemingly unrelated resources, (3) getting references from partners that may lead entrepreneurs to a new business network.

Studies of the role of structural characteristics of networks on the performance of new firms are not conclusive. Several studies have stressed that linkages with tight networks are more advantageous for the early growth of firms (Gulati, 1995), while others emphasize the importance of being connected to loose networks (McEvily and Zaheer, 1999). This consideration leads to our first hypotheses:

*Hypothesis 1a The performance of USOs is positively affected by tight networks.*

*Hypothesis 1b The performance of USOs is positively affected by loose networks.*

### **3.1.2 Strength of Relationships: Strong or Weak Relationships**

Whereas the above characteristics, tightness refers to structure of the networks. Strength of the relationship refers to the quality of relationship. The strength of relationships between USOs and their partners varies based on the time invested in the relationships. Usually, strong relationships are based on long-term and intense interactions. Typical examples of strong relationships include friendship and family ties. However, Granovetter (1995) defines the strength of relationships based on time and emotions invested in a relationship, as well as the reciprocity involved between participating actors. As people know each other more and become emotionally involved, they will develop a relationship in which they put their trust, commitment and willingness to support each other reciprocally. This type of relationship is important for entrepreneurs that try to market an unproven product and have limited resources. In such situations characterized by a high level of uncertainty, entrepreneurs will heavily rely on close friends or family members for learning, protection and support.

The concept of social networks presents a contradictory argument. Although initially developed by sociologists, this concept has been increasingly used to explain economic actions (e.g Larson and Starr, 1993). Granovetter (1973) argues that new information is obtained through casual acquaintances rather than through strong personal relationships. Since the strongly connected actors are likely to interact frequently, much of information that circulates in this social system is the same. Conversely, *weak ties* often include links with actors who move in social circles other than those of the focal actors. It is suggested that weak ties are an important source of information about activities, resources, and opportunities in distant parts of social system. Weak ties are often more important in spreading information or resources because they tend to serve as a bridge between otherwise disconnected social networks. In attempts to obtain resources for growth, weak ties may be essential for USOs. It is through weak ties that USOs can recognize novel information which leads them to new resources and enabling to exploit a new business opportunities. Because of the contradiction the above argument, we formulate the following hypotheses:

*Hypothesis 2a The performance of USOs is positively affected by strong relationships.*

*Hypothesis 2b The performance of USOs is positively affected by weak relationships.*

### **3.1.3 Social Characteristics: Heterogeneity of Contact Background**

The third hypothesis is about the social characteristics of networks. Marsden (1987) shows that diverse partners integrating several spheres of society often facilitate more beneficial actions to individuals than similar partners. With regards to USOs' development, partners that come from a different environment of USOs have more variety in their perceptions and give access to a wider range of resources. The more heterogenous partners USOs have, the more

variety of resources such as know-how, information and expertise to USOs can access. Hence, heterogeneity of partners' backgrounds increases the likelihood of obtaining valuable information, knowledge, and guides spin-offs to different resources. Therefore, we hypothesize as follows:

*Hypothesis 3 The performance of USOs is positively affected by a large heterogeneity of partners' backgrounds.*

#### **3.1.4 Spatial Dimension: Geographical Proximity**

In the study of network creation, it is assumed that networks do not randomly link individuals. Rather, people interact most frequently with those in close geographical proximity and with whom they share common backgrounds, interests and affiliations (Gertler, 2003). Because both physical and social locations strongly influence people's activities, proximity on these dimensions increases the likelihood of interaction and communication (Blau, 1977). More specifically, spatial proximity decreases direct costs associated with frequent and extended interaction necessary for maintaining social relationships (Zipf, 1949), particularly close personal networks. As the geographical distance between spin-offs and their partners increases, the opportunity for meeting in person and face-to-face interaction is lower and it is more difficult to maintain an effective relationship. In contrast, a network of partners that is clustered provides a greater opportunity to interact actively with partners and to benefit from knowledge spillovers (e.g. Audretsch, 1998; Camagni, 1991). Accordingly, we argue that a close spatial proximity between USOs and their partners will have a positive influence on USOs' performance.

*Hypothesis 4 The performance of USOs is positively affected by a close spatial proximity to network partners.*

#### **3.2 Support from Incubation Organizations**

The last hypothesis is related with the nature of support provided by incubator organizations. The nature of support may vary considerably, dependent upon the perceived needs of start-ups and the competence and resources of incubators. Conventional support is oriented towards the provision of 'basic resources', e.g. office, administration and financial support. However, there has been an important evolution in the kinds of support, from conventional to added value support; the latter includes support such as entrepreneurial courses for enhancing business skills, business mentoring and networking services. Overall, the types of support provided by incubator organizations can be grouped into two following categories:

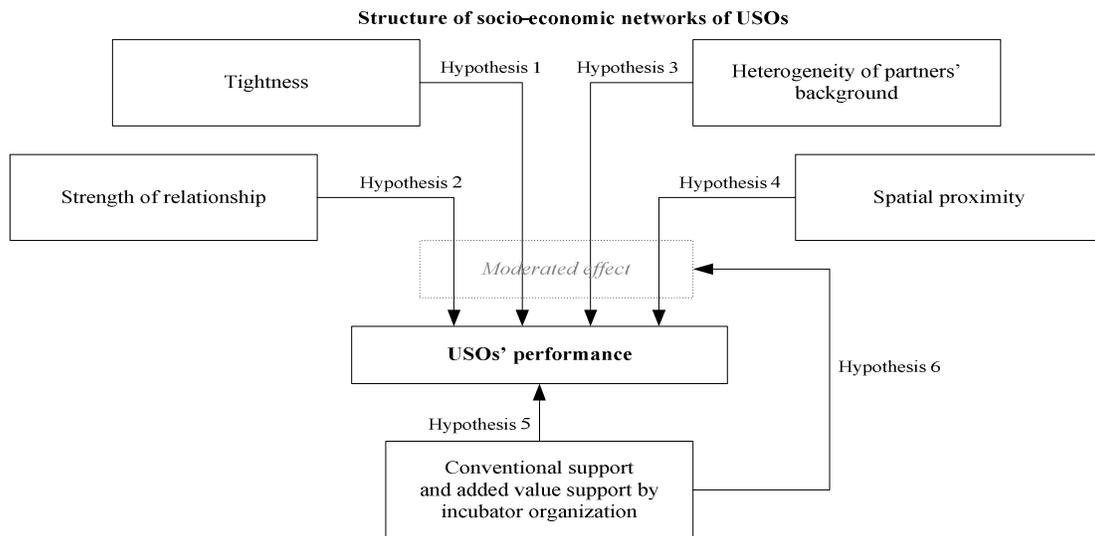
1. Conventional support (e.g. loan, grant, venture capital, office facilities, shared administration facilities)
2. Added value support (e.g. business counseling, consultation, entrepreneurial training, networking possibility, equipment and research facilities)

In this study, we assume that conventional support only fulfill a basic need of USOs. It may help USOs to overcome their first obstacles in terms of initial investment and office. However, for further development, USOs may need more added value support as well. Therefore, we propose the following hypothesis:

*Hypothesis 5 USOs which receive conventional support plus value-added support perform better than USOs that receive only conventional support.*

Related with socioeconomic networks of USOs, we assume that added value support; especially support such as in searching for partners, will moderate the relationship between socio economic networks and performance. Therefore, we hypothesize as follows:

*Hypothesis 6 The performance of USOs is positively affected by the interaction effect between socio economic networks and network building support.*



**Figure 1. Determinant factors of USOs' performance**

#### 4. Research Design

The study draws on a survey of university spin-offs of TU Delft, the Netherlands. In total the population includes 61 spin-offs, defined by two criteria, that is age not older than 10 years and having received support at least one type of support from TU Delft. The response rate was 67% leading to 41 valid interviews.

In this study, an Ordinary Least Square (OLS) regression analysis was used (see appendix for the explanation of the variables). To test the hypotheses, five models were estimated. Model 1 tested the hypotheses about socio-economic networks of the USOs. The impact of support was tested in model 2 and 3. Model 2 include a single variable explaining whether the USOs received only conventional support and/or added value support. In the next model (model 3), we examined the roles of each type of support in determining the USOs' performance. Moreover, we also conducted a regression analysis by combining the factors of the socioeconomic network and support from incubators in one model (model 4 and 5).

In the next step, the moderating influence of one single support measurement, i.e. support in network building, was tested.

A moderated hierarchical regression analysis was utilized following the method described by Cohen and Cohen (1983). According to their method, the change in  $R^2$  was evaluated as an indicator for model significance. In the first step, the characteristics of the socioeconomic networks were entered, in the second step the support variable was added, and this was

followed in the third step by add the interaction effect between the support and each of the characteristics of socio-economic networks.

One of the pitfalls in estimating regression models is the existence of multicollinearity among independent variables. To check for multicollinearity, the so-called variance inflation factor (VIF) was used, which is the reciprocal of tolerance. Large VIFs are an indication for the presence of multicollinearity. The VIFs found in the estimates ranged from 1.24 to 1.58, meaning that no multicollinearity problems occurred.

## 5. Empirical results

### 5.1 Descriptive statistics

In this section we provide descriptive statistics. Table 1 shows a brief description of our sample. The number of firms in each age category has the same proportion. TU Delft's spin-offs are relatively small firms, most of them have less than 5 employees (44%) and almost one third have between 5 and 10 employees (37%). Most of the spin-offs can be seen as strongly innovative. They have in-house R&D (92%) and invest quite a large amount in R&D. Around 70 % of the spin-offs spend more than 10 percent of annual turnover in this activity. The USOs produce turn over from different sources, including selling products, consultation, and development and design. In some cases, the spin-offs have more than one source of income.

**Table 1. Descriptive Statistics of sample**

Characteristics	Absolute	Percentage
<i>Age</i>		
- Less than 4 years old	14	34.15
- 4-6 years	14	34.15
- More than 6 years	13	31.71
<i>Size (fte)</i>		
- Less than 5 fte	18	43.90
- 5-10 fte	15	36.59
- More than 10 fte	8	19.51
<i>In-house research and development</i>	38	92.00
<i>R&amp;D ( per cent of annual turnover)</i>		
- None	5	12.20
- Less than 10 per cent	7	17.07
- 10-30 per cent	18	43.90
- More than 30 per cent	11	26.83
<i>Source of turnover<sup>a</sup></i>		
- Product sale	22	31.43
- Consultation	24	34.29
- Development and design	24	34.29

Note: <sup>a</sup> → more than one category possible per firm.

Table 2 shows obstacles faced by the USOs during their development. It appears that knowledge (skills) is the most problematic need, especially marketing knowledge and sales skills. Dealing with future uncertainty together with a lack of capability in forecasting future markets is one of the problems faced by most of the USOs. Next important is a shortage in skills to handle management overload. Half of the spin-offs also report that they face financial problems. Other issues, such as accommodation and the availability of research infrastructure appear to be of minor importance. The previous findings are similar with the findings of a study of problematic needs experienced by TU Delft spin-offs in 2002 (Van Geenhuizen and Soetanto, 2003)

**Table 2. Problematic obstacles**

Obstacles	Specification	Total	%	Rank
Market-related knowledge	Lack of marketing knowledge	22	15.71	1
	Lack of sales skills	20	14.29	2
	Lack of forecasting capability about future markets	18	12.86	4
Management-skills	Difficulty in dealing with uncertainty	19	13.57	3
	Too many managerial tasks to handle	12	8.57	5
Market	Lack of market demand	10	7.14	6
Financial	Lack of investment capital	9	6.43	7
	Lack of cash flow	6	4.29	8
Physical	Lack of adequate accommodation	5	3.57	9
	Lack of research and testing facilities	4	2.86	10

Note: more than one obstacle possible per firm.

It is not surprising that shortages in market- and management-related knowledge and skills are the major obstacles, since USOs evolve from an initial idea in a non-commercial environment to a competitive profit generating firm, a stage in which new and completely different knowledge and routines are required (Vohora *et al.*, 2004). To overcome these obstacles, it is assumed that USOs seek external support through their socioeconomic networks.

**Table 3. Descriptive statistics of variables used in analysis**

Dependent variable	Mean	S.D
Job growth (fte, 1996-2005)	1.10	1.02
<b>Independent variables</b>		
<b>Characteristics of network</b>		
	<b>Mean</b>	<b>S.D</b>
Number of partners (2005)	3.75	.965
Frequency of interaction with partner (2005)	2.28 (per month)	1.26 (per month)
Duration of relationship with partner	6.00 (year)	2.73 (year)
Heterogeneity index	0.58	0.13
Spatial proximity of partners	20.11 (minutes by car)	7.39 (minutes by car)
<b>Type of support</b>		
	<b>Absolute</b>	<b>Percentage</b>
Office and services	19	46.34%
Grant, loan or venture capital	21	51.22%
Marketing-related support	15	36.59%
Managerial consultation	15	36.59%
Network building	14	34.15%
Training/seminar	26	63.41%
Access to research results from university	10	24.39%
Access to research facilities at the university	16	39.02%

Table 3 shows the descriptive statistics of some network characteristics (see also appendix). We have measured network characteristics by using the name-generator technique. This technique is conducted by asking the respondent to name individuals with whom they mainly interact concerning exchange of information about business problems and opportunities and concerning other types of resources. Consistent with other studies, TU Delft's spin-offs have 3.75 partners on average. The study by Renzulli *et al.* (2001) reported that spin-offs have an average of 4.8 external partners. McEvily and Zaheer found the number of 3.5 connected partners per spin-offs. According to the entrepreneurs, they meet their partners in face to face interactions 2.28 times per month on average. Our respondents reported that they have known the contacts for 6.00 years on average. Related with support, most of the respondents reported that they received support such as training or seminar (63.41%) and loan or grant (51.15%).

## 5.2 Regression analysis

In this section, we examine to what extent the previously discussed socioeconomic networks influence the growth of USOs. In addition, we examine the influence of various support measures that USOs have received from the incubator and/or directly from the university. To these purposes, a regression analysis was performed. Table 4 reports the results of five models generated in the regression analysis. We start with a discussion about the statistical significance of each variable followed by the interpretation of the sign of the regression coefficient of each variable. Next, we will discuss the results from the moderated hierarchical regression analysis. At the end of this section, we will draw conclusions on the hypotheses.

**Table 4. Results of ordinary least squares regression**

Job growth as a dependent variable	Model 1	Model 2	Model 3	Model 4	Model 5
Independent variables	$\beta$	$\beta$	$\beta$	$\beta$	$\beta$
<b><i>Socio-economic networks</i></b>					
Tightness	-.321**			-.299**	-.308**
Strength of relationship	-.329*			-.196*	-.293*
Heterogeneity in partners' background	-.269**			-.258*	-.288*
Spatial proximity (of network partners)	.442**			.405**	.463**
<b><i>Mix of support</i></b>					
Mixed conventional and added value support		.588**		.190*	
<b><i>Type of support</i></b>					
<b><i>Conventional support</i></b>					
Office and services			-.329**		-.148*
Grant, loan or venture capital			-.300*		-.046
<b><i>Added value support</i></b>					
Marketing-related support			.365**		.086
Managerial consultation			.022		.076
Network building			.432**		.059
Training/seminar			.048		.033
Access to research results from university			.225		.030
Access to research facilities in university			.073		-.014
F	22.64	13.89	2.34	20.59	8.41
Significance of F (Prob<F)	0.00	0.00	0.04	0.00	0.00
R2	0.7155	.2626	.3692	0.7462	0.7829
Adjusted R2	0.6839	.2437	.2114	0.7100	.6898

\* p < 0.10 \*\* p < 0.05 \*\*\* p < 0.01

All variables concerning the network characteristics are consistently significant throughout model 1, 4 and 5 and so is the variable concerning a mix of conventional and added value support in model 2 and 4. With regard to the different types of support (model 3), only four variables (e.g. office and service, grant/loan or venture capital, marketing-related support, and network building) are significant. Model 4 shows, however, that a mix of support is only marginally significant (p < 0.10). In model 5, almost all support variables are not significant. Only office support is marginally significant (p < 0.10). We may conclude that network characteristic variables dominate as influence on performance of USOs.

Our next discussion will focus on the direction (*sign*) of the regression coefficients. Model 1 presents the influence of socio-economic networks. The literature shows the ambiguous pattern of a positive relationship being either tight or loose. However, our results reveal that a loose network is essential. This implies that having partners in different networks (loose networks) tends to increase USOs' performance. With regard to hypothesis 2, employing

weak relationships appears to be important for growth of the spin-offs. Further, the hypothesis about a positive relationship between USOs' performance and heterogeneity of contacts' background is confirmed. In addition, the results fail to prove the positive impact of nearby partners in determining USOs' performance. Apparently, local knowledge spillovers have no positive impact on USOs' growth. With regard to the kind of support (hypothesis 5), the regression results (model 2) indicate that a combination of conventional and added value support tends to enhance growth. The results point out that the more diverse the added value support received by USOs is, the better USOs' performance is.

The regression model (model 3) reveals different findings concerning the hypothesis about the role of individual support measures. Some support such as marketing-related support and network building are found to positively influence the USOs' performance. The two types of conventional support show a negative sign. This would mean that USOs who receive such support do not perform well. Probably, this is caused by the fact that our sample includes a relatively large share of young spin-offs that have received this support but could not grow yet because of their young age (34%- 2-4 years old). This result once more confirms that USOs which receive a combination of conventional and added value support perform better.

**Table 5. Moderated hierarchical regression analysis**

Step	1 Socio economic network (B, C, D, and E)	2 Network building support (A)	3 Interaction variables			
			A x B	A x C	A x D	A x E
R2	0.716	0.746	0.747			
ΔR		0.031	0.001			
F		4.237**	0.098			
R2	0.716	0.746		0.747		
ΔR		0.031		0.001		
F		4.237**		0.160		
R2	0.716	0.746			0.783	
ΔR		0.031			0.037	
F		4.237**			5.727**	
R2	0.716	0.746				0.746
ΔR		0.031				0.000
F		4.237**				0.026

Note: A: Network building support; B: Tightness; C: Strength of relationship; D: Heterogeneity in partners background; E: Spatial proximity

Interaction	Coefficient
Network building support x Tightness (A x B)	-0.050
Network building support x Strength of relationship (A x C)	-0.020
Network building support x Heterogeneity in partner's background (A x D)	-0.228**
Network building support x Spatial proximity (A x E)	0.010

\* p < 0.10 \* \*p < 0.05 \*\*\* p < 0.01

The previous analysis suggests positive relationships between the characteristics of networks, that is loose networks, weak relationships, heterogeneous contacts and a large distance to partners and the performance of USOs. In order to identify whether network building support plays a role in moderating these relationships, we employed a two-ways moderated hierarchical regression model. The results (table 5) show that a significant influence only appears with regard to heterogeneity of the partners' backgrounds. Interaction between network support and other network characteristics is not significant. Apparently, socioeconomic networks develop and grow under the influence of other factors, such as the entrepreneurs' capability in establishing networks, location history, or relationships already

present before the companies started. We may summarize our results in terms of rejecting or accepting the hypotheses in table 6.

**Table 6. Summary of hypothesis**

Hypotheses	Description	Conclusion
Hypothesis 1a	Performance of USOs is positively affected by tight networks.	Rejected
Hypothesis 1b	Performance of USOs is positively affected by loose networks.	Accepted
Hypothesis 2a	Performance of USOs is positively affected by strong relationships.	Rejected
Hypothesis 2b	Performance of USOs is positively affected by weak relationships.	Accepted
Hypothesis 3	Performance of USOs is positively affected by strong heterogeneity of partners' backgrounds.	Accepted
Hypothesis 4	Performance of USOs is positively affected by close spatial proximity between USOs and their partners.	Rejected
Hypothesis 5	USOs which receive conventional support plus value-added support perform better than USOs that receive only conventional support.	Accepted
Hypothesis 6	Performance of USOs is positively affected by the interaction effect between network building support and socio economic network characteristics	Mostly rejected

## 6. Conclusion

The aim of this paper was to explore the influence of socio-economic networks and of various supports on USOs' performance. Our empirical findings confirmed that spin-offs that have networks rich in loose and weak relationships are in a better position to grow compared to spin-offs that employ tight and strong relationships. In addition, a large diversity in the background of partners appeared to be essential. The previous results all point into the same direction, that is, relatively open information (knowledge) sources and flow have a positive influence on growth of innovative companies. In contrast with our expectation, the findings failed to prove that a close spatial proximity of partners has a positive influence on growth. We may understand this result is so far close spatial proximity leads to network characteristics that prevent an open information and knowledge flow. However, the idea that a close proximity apparently does not lead to cost advantages, like in achieving new knowledge (knowledge spillovers), is more difficult to understand. With regard to support provided by incubator organizations and/or directly by the university, the results showed that conventional support is effective if combined with added value support. We may conclude that the overall findings confirm the ongoing discussion in the literature about the need to improve the support provided to USOs. We propose to put a greater emphasize on added value support, particularly on network building that could lead to loose and weak networks and a large diversity in partners' background.

We believe that our case study of TU Delft's spin-offs can be generalized to some extent, namely to technical universities and technical faculties at general universities in Western Europe, particularly in countries facing a relatively weak entrepreneurial (risk-taking) culture. However, there are two things to consider. First, from the perspective of the type of incubation policy. TU Delft's incubation policy is specific as it represents the so-called low selective model (Clarysse *et al.*, 2005). This model aims to create as many start-ups as possible and focuses on providing conventional support. Second, from the location perspective. TU Delft's spin-offs are located at a close distance of two important large cities, The Hague and Rotterdam. This poly-centric pattern of cities may lead to different spatial networks compared with spin-offs located in single cities.

Despite the interesting results, we acknowledge that there are some limitations in our study. The limitations are methodological in nature. First, we were not able to exclude a certain fuzziness in the data on personal networks with regard to spin-offs managed by more than one entrepreneur. This is a common situation in network study using so-called ego-centric technique (Brewer and Webster, 1999). In addition, a certain bias has entered the measurement of openness of the networks with regard to weak relationships. It was difficult to identify whether network partners in a weak relationship interact with each other independent of the ego.

In conclusion, this study is to be viewed as a first effort to identify broad patterns of socioeconomic networks experienced by USOs and the influence of these patterns on growth. In a next step, this study can be extended by conducting research that may lead to: a more refined understanding of the role of spatial proximity of networks in influencing growth of USOs and of the interaction effect of age on other factors in determining this growth.

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## Appendix

Regression	Variables	Description
Linear regression and moderated hierarchical regression	Job growth	Measured by average annual growth in full-time equivalents.
	Tightness	Measured by the number of existing relationship divided by the number of potential relationship. The value of this variable is between 0 and 1. A low value indicates a loose network and a high value indicates a tight network.
	Strength of relationship	Measured by two criteria: the average frequency of interaction and the number of years the relationships have lasted. $=(\text{\#frequency of interaction}/\text{\#partner})+(\text{\#number of years the relationship}/\text{\#partners})$ A low value indicates a weak relationship and a high value indicates a strong relationship.
	Heterogeneity	Measured by the sum of the outcomes of the heterogeneity index of each type of partners' background (e.g. academic, business). The index is calculated on the basis of the square of the number of partners from a similar background divided by the total number of partners. A high value indicates that many partners come from the same background and a low value indicates that partners have diverse background.
	Spatial proximity	Measured by the average travel time to partners. $=(\text{\#travel time}/\text{\#partner})$ A low value indicates a close proximity and a high value indicates a large distance.
	Network building support	The variable is a dummy variable for the network building support received by the USOs. (1=received support; 0=did not receive support)
Linear regression	Mixed support	The variable is a rank variable for the types of support. The codification is as follows : Rank 1 : Only conventional support. Rank 2 : Conventional and 20% added value support or only 60% and more added value support. Rank 3 : Conventional and 40% - 60% added value support. Rank 4 : Conventional and 60% and more added value support.
	Type of support (8 types)	Each variable is a dummy variable (1=received support; 0=did not receive support)