

Venture capital and sequential investment

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Abstract

One of the defining characteristics of venture capital investment is the sequential injection of capital the purpose of which is to reduce agency problems and to lend greater flexibility to the investment undertaken. The venture capitalist (VC) will put an end to his investment if the profit flows do not meet his expectations.

This paper develops a two-stage theoretical model enabling the VC to determine two profit-flow thresholds. He will invest if profit flows trigger these milestones, assuming the firm's profit flows are uncertain and follow an arithmetic Brownian motion. Our model is based on a real options approach and allows for VC risk aversion and equity allocation on each investment.

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1 Introduction

The start-up's¹ life cycle is decomposed in several stages, each stage requiring a particular financial method which permits to the firm to develop itself and to reach the maturity level. The first stage deals with the creation of the firm and the beginning of the product's conception; it gathers ideas of some entrepreneurs who decide to launch a new product. Then comes the need for a capital contribution which will be supplied by the family and the friends of the entrepreneurs.

Later, there is the stage of the product development which requires a more important capital contribution. Being financially limited, the entrepreneurs will move towards wealthy private individuals, incumbents and business angels² who give the first external funds to the firm in creation. These investors bring their own money and advices in order to drive the project to a more developed level.

The product validation, its development, its manufacturing and its commercialization represent the third stage of the firm creation. This stage, which is very important and very costly for the entrepreneur, needs a new capital contribution which will be given by venture capital firms. They bring at several times their financing and their expertise in order to carry the product development and the firm through a successful conclusion. This stage is decisive for the firm because it permits the finalization and the commercialization of the finished product and the sales follow-up bringing the project to maturity.

The fourth and last stage is the stock exchange introduction or its partial or total acquisition by another strategic buyer. It conveys the end of the follow-up and the financing by the VC. During this stage, the more mature start-up gets financing from big firms or the financial market³.

Thus, venture capital is a means of financing used by entrepreneurs when they do not have

¹The term start-up means young and innovative firms with a strong potential of growth, high technology and a very high bankruptcy risk.

²French association of private equity investors

³The young firm can also have a decline stage requiring resorting to a "turnaround" investor which will apply adequate measures to help the firm to find its balance again.

enough internal resources to be self-financed and have no access to the traditional financing method which is bank loan. The nature of the start-up, its age and its activity sector are factors that offer few guarantees to banks for the repayment of loans and interests. Banking financing requires some criteria that young firms do not possess. Indeed, intangible assets, negative cash flows and the lack of accounting history offer very few guarantees to investors. Indeed, they have a strong bankruptcy risk and the available resources of the company are wholly injected into the firm's development cycle, which leaves little liquidity for interest payment. Then, the appropriate financing method is the acquisition of a stake in the capital. Another point which penalizes access to banking credit is the lack of skills for banks to evaluate projects with specific assets and a strong uncertainty about future profitability of the firm.

A VC is a specialized investor whose mission is to select young firms in which he will invest in order to allocate to each firm a part of his fund and to provide ongoing monitoring of the managers while bringing his expertise and his experience. This funding is akin to taking a stake in the firm, whose capital gain is gathered at the VC's exit time. The remuneration of the VC is made on this capital gain; hence he must pay a close attention to the supervision and the monitoring of the entrepreneur and the management team. Indeed, these young firms can have a bad management as the entrepreneur being interested in his private benefits, which are not always in line with those of the investors; this leads the VC to conclude contracts to reduce agency problems.

So, the manager may not act in the interest of the investors. For example, he can keep a non profitable project or which yields a weak profitability to investors in a private goal, whereas the VC is principally concerned with the monetary value of his investment in the start-up. Indeed, the manager can receive negative informations concerning his product, for example the weak demand on the market. So, the VC has to find ways to supervise and monitor the manager's acts.

At different stages of his investment, the VC receives informations concerning the potential of the project. If the received informations are positive and likely to envisage an exit through an initial public offering (IPO), he continues his financing. On the other hand, if the project seems to be viable but with little chance to emerge in an exit through an IPO, the VC will quickly look for a strategic buyer in order to exit from the firm. When the news are rather negative and when the project has very little chance to materialize, the firm is liquidated and the amount which would have been allocated to this firm during the next stage can be redeployed to another project.

The VC uses several mechanisms of supervision in order to reduce agency problems. Sahlman (1990) [12] showed that the use of convertible financial products, syndication and sequential investment allow to minimize these problems.

Several VCs can co-invest in the same project. The aim of this practice is to share risk and to have different opinions on the evolution and the interest of the firm. In this case, the role of the lead VC is very important because his decision to continue or not the financing of the venture has an influence on the decision of the other VCs. Thus, if the leader decides to stop investing in the start-up, the other VCs will receive a negative signal about the growth perspectives and about the quality of this firm, the project being not viable or having little chance to succeed. The followers VCs will do the same and will stop the financing.

Sequential investment facilitates too the VC's task in the sense that he is not obliged to give an important amount from the beginning of the financing (or at an early stage) at the risk of losing all his investment if the project does not succeed. The investment decision can be challenged if the entrepreneur does not fulfill the necessary conditions to the development of the operation. As each investment carried out by the VC implies a strong risk of failure, it is advisable to sequentially inject the amount allocated to each firm in order to dilute this risk and to keep the option of leaving in case of bad news or unfavorable evolutions about the future profit flows of the financed firm.

This means of financing is preferred by the VC because it allows him to have flexibility on his investment. Indeed, after the first investment, the VC waits for new informations and the reaching of some milestones⁴ in order to continue his investment and to give a new payment to the firm. This process is used to supervise the entrepreneur's acts and to make sure that he respects his engagement towards the VC. It permits too to be sure that the entrepreneur puts in the necessary effort to increase the value of the firm. This mechanism permits the VC to threaten the management team to stop funding at the next stage if the intermediary results are not promising and if the determined targets (milestones) are not reached. The VC protects himself against an eventual moral hazard. This means of financing permits the VC to leave the project; this leads the entrepreneur to deploy a supplementary effort in order to receive another financing from the VC.

This technique reduces the investment exposure to bear risk by allowing the VC to inject funds only if the targets are reached. So, the VC needs to better evaluate the eventual agency and monitoring costs in order to determine the frequency with which he will reevaluate the firm and liberate the following investment.

Grompers and Lerner (1999) [7], Sahlman (1990) [12] and Wang and Zhou (2004) [15] have indicated that the best way for the VC to monitor and control the firm is to carry out sequential investment. As we said, the aim of this means of financing is to encourage the manager to act in the investor interests in order to guarantee the continuity of the investment. However, these constraints of results can lead to an opportunist behavior from the manager who can be attempted to change his accounts so that the VC continues his financing (Savignac (2007) [13]). This practice is costly for the manager, particularly when the firm is young. Indeed, from a game theory model, Pouget (2007) [11] has explained that the manager can make-up his accounts to submit intermediary results which are in conformity with the VC's expectation. Nevertheless, this falsification of the signal can be

⁴The milestones are goals which will act as criterions for the release of some clauses, as the amount of capital to be invested in the following investment.

very costly if the firm is of bad quality. Thus, to limit such acts, the VC often calls for due diligences showing realistic quantitative forecasts that might be costly for the entrepreneurs who are thinking to dupe the venture capitalist investors. Thus, these high costs slow down entrepreneurs from carrying out bad projects.

The staging of the investment allows the VC to maintain the option of leaving the project. The riskier is the projet, the higher is this option. If all the capital is invested from the beginning of the project (up-front financing), the VC loses this stopping option. Thus, gradually investing capital permits the VC to supervise the project and to decide the refinancing. Indeed, acquired information about the viability of the firm between each stage of the investment prevents him to lose money in pursuing financings in ineffective projects.

The risk of agency problems is higher when the firm has intangible assets, which requires a more frequent supervision from the VC and a shorter waiting period between two stages of financing. These problems seem to occur less frequently when the firm holds tangible assets, because it increases the market value of the project, which rises the waiting period between two financment rounds (Gompers (1995) [6]).

Regarding the empirical works, (Gompers (1995) [6]) showed that firms which exit through an IPO received more financings from the VCs and more investment rounds in relation to other firms. His empirical study confirmed that the shorter the period between two financing rounds is, the more the VC monitor the evolution of the venture and receives more new informations likely to make him modifying his decision. (Gompers (1995) [4]) also emphasized that the VC is subjected to costs related to his investment: at each capital injection, he has to draw up reports on the firm's activities and to contact lawyers to sign a new contract, which generates supplementary fees.

From a sample of 794 VC's backed firms, (Gompers (1995) [4]) demonstrated that high

technology firms receive more investment rounds and higher financings than firms belonging to another industries. Thus, projects with high market to book ratio and low tangible assets receive higher amounts. This encourages firms which can not be financed by debt to resort to VCs to develop their project.

With sequential investment, the VC dynamically allocates the investing amount in the project, which allows him to access to the next stage. The release of the financing is done when the targets predetermined by the VC are reached. These targets can be of several types: crossing of some financial levels, when the product/service developed by the firm goes from a prototype stage to a commercialization stage, etc.

In order to identify these milestones, we consider that the threshold that trigger the injection of new funds are from financial order and represented by the future flows of the firms. In other words, we'll try to determine the profit flows threshold allowing the VC to finance again the project. Thus, at each stage, the VC can decide to stop his investment if he estimates that the flows move in a bad direction. This comes back to consider that the kind of investment decision can be assimilated to an option where the VC can (and not must) continue to finance the project and stop it at each stage.

To our knowledge, this paper is the only one to model this sequential investment decision in the start-ups in presence of uncertainty about the future flows of the firm and with taking into account the VC's risk aversion and the capital share allocated to the VC at each capital injection. The different theoretical models developed in the literature consider that the value of a firm financed by a VC is known or that its evolution is deterministic (Giudici and Paleari (2000) [5]), which is not the case when the firm is young and when it belongs to an innovating industry. Some researchers also use game theory models in order to formalize the informational asymmetry in the relationship between the manager and the VC (Pouget (2007) [11]), however this approach doesn't take into account the sequential side of the investment.

The next section presents the model allowing determining the threshold levels that trigger fundings when the investment is done sequentially. We take into account the VC's risk aversion and we compute the ownership stake of capital received by the VC after each investment.

2 The model

2.1 Preliminaries

I_1 (I_2)	The VC's investment amount at the first (second) stage
V_1^- (V_1^+)	Firm value before (after) the first investment
V_2^- (V_2^+)	Firm value before (after) the second investment
α_1 (α_2)	Ownership stake hold by the VC after his first (second) investment
τ_1 (τ_2)	Optimal timing of the first (second) investment
π_1^- (π_1^+)	Firm's profit flows before (after) the first funding
π_2^- (π_2^+)	Firm's profit flows before (after) the second funding
μ	Drift of the profit flows, assumed constant
σ	Volatility of the profit flows, assumed constant
ρ	Rate of return required by the VC, assumed constant
dW_t	A standard brownian motion
dq_t	A jump process with $dq_t = \begin{cases} 0 & \text{with the probability } (1 - \lambda dt) \\ 1 & \text{with the probability } (\lambda dt) \end{cases}$
g_1 (g_2)	The intensity of the jump caused by the first investment I_1 (respectively I_2)
C_1 (C_2)	Costs linked to the first (second) investment
U	A constant relative risk aversion (CRRA) utility function
W_0	Initial wealth of the VC

Table 1: Definition of parameters

The firms which are the subject of a study for an eventual financing from a VC generally belong to an innovating activity sector, which implies strong uncertainty about the future value of these firms and their successful outcome. The value of these firms corresponds to the actualization of their future flows. Thus, in order to take into account the uncertainty and the risk that these start-ups' flows can be negative, it is convenient to assume that these flows follow the following arithmetic Brownian motion⁵ :

$$d\pi_t = \mu dt + \sigma dW_t \quad (1)$$

Thus, the expected value of the flows π_t equals:

$$E(\pi_t|\pi_0) = \pi_0 + \mu t \quad (2)$$

The actualization of these future flows allows us to determine the value of the firm in which the VC wishes to invest in:

$$V_t = \int_t^{+\infty} E(\pi_s|\pi_t) e^{-\rho(s-t)} ds \quad (3)$$

Considering the equation (2), the value of the firm equals:

$$V_t = \frac{\pi_t}{\rho} + \frac{\mu}{\rho^2} \quad (4)$$

2.2 The investment decision

As indicated by Li (2008) [9], the VC's investment being irreversible, there is a waiting value for the VC before investing in the firm's portfolio. The higher this waiting value is, the higher uncertainty is.

Then, real options are an appropriate means to model the VC's investment decision. Indeed, they give the right to take future decisions by offering flexibility to the VC to continue or not his investment according to new informations. This allows him to take advantage of favorable evolutions of the firm's future flows and to limit his losses in case of failure of the

⁵Parameters used in this model are summarized in the table 1.

operation. Actually, in case of failure, the VC does not recover his initial investment, all the amount allocated to the firm is lost.

The aim of the VC being to maximize the expected utility of his final wealth, he has to solve the following dynamic equation:

$$F(\pi_t) = \max\{U(W(\pi_t)) ; \frac{1}{1 + \rho dt} E[F(\pi_{t+dt})|\pi_t]\} \quad (5)$$

$F(\pi_t)$ is the value function of the VC reflecting the optimal strategies⁶ that he has to implement in order to maximize his utility. Equation (5) is composed of two terms: (i) the first term $U(W(\pi_t))$ represents the VC's immediate utility if he decides to invest in the firm, that's what we call the stopping region, (ii) the second term $\frac{1}{1+\rho dt} E[F(\pi_{t+dt})|\pi_t]$ represents the continuation region (or waiting region) and corresponds to the VC's expected utility value if he waits another period to decide to invest or not in the firm.

The waiting region :

The second term of the dynamic equation conveys the VC's waiting and is written, in continuous time, under the following form⁷

$$\rho F(\pi_t) = \frac{1}{dt} E[d(F_{\pi_t})|\pi_t] \quad (6)$$

This equation is obtained by multiplying by $(1 + \rho dt)$ the second term of the right part of (5), and by deleting the terms which go to zero quicker than dt when dt tends to 0.

The Ito lemma application allows us to write (6) under the form of the following ordinary differential equation (ODE):

$$\frac{1}{2} \sigma^2 F''(\pi_t) + \mu F'(\pi_t) - \rho F(\pi_t) = 0 \quad (7)$$

⁶The VC's optimal strategies are of two types: (i) the choice of the investment optimal timing at each stage and (ii) the choice of the optimal exit time. In a previous work (Trabelsi (2008) [14]), we have studied the timing of the VC's initial public offering. Thus, this article only concentrates on the VC's sequential investment decision.

⁷This equation satisfy the non arbitrage condition.

which general solution has the form $F(\pi) = Ae^{\beta\pi}$.

In order to find the expression of β , it is convenient to replace $F(\pi)$ and its derivatives by $Ae^{\beta\pi}$ and its derivatives in the ODE (7). Then, β is the solution of this quadratic equation:

$$\frac{1}{2}\sigma^2\beta^2 + \mu\beta - \rho = 0 \quad (8)$$

So⁸

$$\beta = \frac{-\mu + \sqrt{\mu^2 + 2\sigma^2\rho}}{\sigma^2} \quad (9)$$

It remains now to determine parameter A and the optimal levels π_1^* and π_2^* which trigger investments. The determination of these parameters requires conditions on the bounds appropriate to each stage of the investment.

2.2.1 Sequential investment study

As we have pointed out in the related literature, VC's investment in a firm is sequentially implemented in order to reduce agency problems and to keep an exit option if intermediary results are not satisfactory.

Let's begin to determine the ownership stake received by the VC after his investments.

Determination of the ownership stake received: At each investment made by the VC, the entrepreneur carries out a capital augmentation in order to give shares to the VC. The VC holds a stake in the firm equals to α_i after his cash contribution at the period i . In order to determine this proportion, we will follow the logic of Dubocage and Rivaud-Danset (2006) [4] and Cossin and al (2003) [2]. These authors have indicated that the part allocated to the VC at each investment equals:

$$\alpha_i = \frac{I_i}{I_i + V_i^-} \quad (10)$$

⁸The negative solution of β has to be dismissed, otherwise $\lim_{\pi \rightarrow -\infty} U(\pi) = +\infty$.

With I_1 the amount invested by the VC at the date i and V_i^- the pre-money value of the firm before VC's investment in the firm.

Our analysis lies in a two period sequential framework, where the VC has always the choice between investing and waiting another period. Each investment implies an ownership stake from the VC in the firm.

Ownership stake received after the first investment:

Taking into account the evaluation of the financed firm, if the optimal choice offered to the VC is immediate investment (at the optimal date τ_1), then he'll receive a proportion equal to:

$$\alpha_1 = \frac{I_1}{I_1 + V_{\tau_1}^-} \quad (11)$$

With

$$V_{\tau_1}^- = \frac{\pi_{\tau_1}}{\rho} + \frac{\mu}{\rho^2} \quad (12)$$

Ownership stake received after the second investment:

If it's optimal for the VC to pursue his financing in the firm, then he receives a new stake after his contribution. The new capital share α_2' he receives at the optimal investment date τ_2 then equals:

$$\alpha_2' = \frac{I_2}{I_2 + V_{\tau_2}^-} \quad (13)$$

We should notice that the proportion α_1 will be diluted at the second capital augmentation used to remunerate the new VC's cash contribution. This fact has not been pointed out in the paper of Cossin and al (2003) [2]; these authors consider that the final proportion held by the VC is the sum of the two percentages received at each stage. In this paper, we will take into account the dilution effect of the first share α_1 ; then the VC's total proportion after his two investments equals:

$$\alpha_2 = \frac{\alpha_1 V_{\tau_2}^-}{I_2 + V_{\tau_2}^-} + \frac{I_2}{I_2 + V_{\tau_2}^-} \quad (14)$$

Consequence of each investment on the firm value : The profit flows of the firm are subject to a positive jump following the arrival of the VC in the capital of the firm. This jump integrates both the investment made by the VC and the non-financial contribution of this investor as he is also involved in managing the firm. As a result, after the first investment, profit flows have to follow this dynamic⁹ :

$$d\pi_t = \mu dt + \sigma dW_t + g_1 dq_t \quad (15)$$

This motion followed by profit flows resembles to an arithmetic Brownian motion with a positive jump. Thus, after the first investment, the expected value of the firm's flows π becomes equal to ¹⁰:

$$E(\pi_s | \pi_{\tau_1}) = \pi_{\tau_1} + (\mu + g_1 \lambda)(s - \tau_1) \quad (16)$$

The value of the firm can thus be expressed according to the profit flows:

$$V_{\tau_1}^+ = E\left[\int_{\tau_1}^{+\infty} \pi_s e^{-\rho(s-\tau_1)} ds | \pi_{\tau_1}\right] \quad (17)$$

Using equation (16), the value of the firm $V_{\tau_1}^+$ after the first financing becomes :

$$V_{\tau_1}^+ = \frac{\pi_{\tau_1}}{\rho} + \frac{\mu + g_1 \lambda}{\rho^2} \quad (18)$$

Following the same reasoning to determine the ownership stake α_2 , we will be located at this date τ_2 which corresponds to the optimal timing of the second investment. At that date, the present value of the flows (thus the value of the firm) includes the effect of the first jump. As a consequence, we have to study the effect of this second investment, it means that we have to take into account the second positive jump of g_2 intensity affected the evolution of the firm's flows (and the value of the firm). As we did above, this jump also integrates the new amount of investment I_2 and the non-financial contribution of the VC.

The expected flows in the case of no investment are :

$$E(\pi_s | \pi_t) = \pi_t + \mu(s - t) \quad (19)$$

⁹The different parameters are defined in the table 1.

¹⁰ $E[dW_t] = 0$, $E[dw_t dq_t] = 0$ and $E[dq_t] = \lambda dt$.

where π_t integrates all the available information until the time t ($\tau_1 < t < \tau_2$). As long as there is not a new injection of capital from the VC, the firm's profit flows do not undergo any jump. As a consequence, at the optimal time τ_2 , the VC decides to invest a new amount I_2 causing a jump in the value of the firm's flows whose expected value is :

$$E(\pi_s|\pi_{\tau_2}) = \pi_{\tau_2} + (\mu + g_2\lambda)(s - \tau_2) \quad (20)$$

The firm value is thus equal to :

$$V_{\tau_2}^+ = \frac{\pi_{\tau_2}}{\rho} + \frac{\mu + g_2\lambda}{\rho^2} \quad (21)$$

As there is no jump between each investment date, the value of the firm just before the second jump has the same expression as the equation (12) :

$$V_{\tau_2}^- = \frac{\pi_{\tau_2}}{\rho} + \frac{\mu}{\rho^2} \quad (22)$$

The expression of the VC's ownership stake (α_2) after his second investment is :

$$\alpha_2 = \frac{\alpha_1\left(\frac{\pi_{\tau_2}}{\rho} + \frac{\mu}{\rho^2}\right) + I_2}{I_2 + \frac{\pi_{\tau_2}}{\rho} + \frac{\mu}{\rho^2}} \quad (23)$$

After having defined the expression of stakes α_1 and α_2 which are received by the VC if he invests at the optimal dates τ_1 and τ_2 , it is advisable to determine the utility of VC at the end of each investment.

2.2.2 The utility of the venture capitalist

The utility function used in this work is of a constant relative risk aversion (CRRA) form. The general form of this function is $U(W) = \frac{1}{\gamma}W^\gamma$ which is described by Ingersoll (1987) [8] and has a constant relative risk aversion equal to $ARR = 1 - \gamma$.

The utility of the VC'wealth when he invests in the project the first cash amount I_1 at the optimal time τ_1 is :

$$U_1(\pi_{\tau_1}) = \frac{1}{\gamma}[\alpha_1 V^+(\pi_{\tau_1}) - C_1 - I_1 + W_0]^\gamma$$

$$\begin{aligned}
&= \frac{1}{\gamma} \left[\alpha_1 \left(\frac{\pi_{\tau_1}}{\rho} + \frac{\mu + g_1 \lambda}{\rho^2} \right) - C_1 - I_1 + W_0 \right]^\gamma \\
&= \frac{1}{\gamma} \left[\frac{\rho I_1}{\rho I_1 + \pi_{\tau_1} + \frac{\mu}{\rho}} \left(\frac{\pi_{\tau_1}}{\rho} + \frac{\mu + g_1 \lambda}{\rho^2} \right) - C_1 - I_1 + W_0 \right]^\gamma \\
&= \frac{1}{\gamma} \left[\frac{I_1}{(\rho I_1 + \pi_{\tau_1} + \frac{\mu}{\rho})} \left(\pi_{\tau_1} + \frac{\mu + g_1 \lambda}{\rho} \right) + -C_1 - I_1 + W_0 \right]^\gamma
\end{aligned} \tag{24}$$

In the same way, his utility function at the optimal date of investment τ_2 is:

$$\begin{aligned}
U_2(\pi_{\tau_2}) &= \frac{1}{\gamma} [\alpha_2 V^+(\pi_{\tau_2}) - C_2 - I_2 + W_0]^\gamma \\
&= \frac{1}{\gamma} \left[\frac{\alpha_1 \left(\frac{\pi_{\tau_2}}{\rho} + \frac{\mu}{\rho^2} \right) + I_2}{I_2 + \frac{\pi_{\tau_2}}{\rho} + \frac{\mu}{\rho^2}} \left(\frac{\pi_{\tau_2}}{\rho} + \frac{\mu + g_2 \lambda}{\rho^2} \right) - C_2 - I_2 + W_0 \right]^\gamma
\end{aligned} \tag{25}$$

C_1 and C_2 represent the cost incurred by the VC when he invests in the project. These costs are a combination of several costs :

1. Costs related to the search for information which are mainly present in the first phase of investment. Indeed, being an external investor, VC must draw up several reports and due diligence¹¹ for well evaluating the prospects for the project and competences of the managerial team.
2. Costs related to the conclusion of contract and lawyers fees. As indicated by Gompers (1999) [7], each time an amount is released, a new contract is concluded and adopted, which increases costs for the VC.
3. Monitoring costs, which are costs, in monetary terms, resulting from the supervision of entrepreneur, monitoring and counseling of the VC in making decisions and managing the company. These costs are assumed to be known in advance by the VC.

It should be noted that the costs C_1 are greater than C_2 as in the second stage of investment, the VC becomes an insider investor who is more informed than an external investor. Thus, the costs of search for information are absent (or tiny) at the investment date τ_2 .

¹¹French association of the investors in capital (AFIC) defines the due diligence as being "the whole measurements of research and information control allowing the investor to make his opinion on the activity, the financial standing, the results, the development prospects, the organization of the company."

2.2.3 Solving the model

The resolution of the optimal strategy of investment of VC maximizing the equation (5) results in the determination of the optimal thresholds π_1^* of investment at date τ_1 and π_2^* of reinvestment at the time τ_2 .

The determination of these optimal threshold levels needs the value matching and smooth pasting conditions. These conditions are specific to each stage of investment.

Value matching and smooth pasting conditions for the first investment

$$\left\{ \begin{array}{l} A_1 e^{\beta \pi_1^*} = U_1(\pi_1^*) = \frac{1}{\gamma} \left[\frac{\rho I_1}{\rho I_1 + \pi_1^* + \frac{\mu}{\rho}} \left(\frac{\pi_1^*}{\rho} + \frac{\mu + g_1 \lambda}{\rho^2} \right) - C_1 - I_1 + W_0 \right]^\gamma \\ \beta A_1 e^{\beta \pi_1^*} = \frac{\rho I_1^2 - I_1 \frac{g_1 \lambda}{\rho}}{(\rho I_1 + \pi_1^* + \frac{\mu}{\rho})^2} \left[\frac{\rho I_1}{\rho I_1 + \pi_1^* + \frac{\mu}{\rho}} \left(\frac{\pi_1^*}{\rho} + \frac{\mu + g_1 \lambda}{\rho^2} \right) - C_1 - I_1 + W_0 \right]^{(\gamma-1)} \end{array} \right. \quad (26)$$

Value matching and smooth pasting conditions for the second investment

$$\left\{ \begin{array}{l} A_2 e^{\beta \pi_2^*} = \frac{1}{\gamma} \left[\frac{\alpha_1 \left(\frac{\pi_2^*}{\rho} + \frac{\mu}{\rho^2} \right) + I_2}{I_2 + \frac{\pi_2^*}{\rho} + \frac{\mu}{\rho^2}} \left(\frac{\pi_2^*}{\rho} + \frac{\mu + g_2 \lambda}{\rho^2} \right) - C_2 - I_2 + W_0 \right]^\gamma \\ \beta A_2 e^{\beta \pi_2^*} = \frac{1}{I_2 + \frac{\pi_2^*}{\rho} + \frac{\mu}{\rho^2}} \left[\frac{1}{\rho} \left(\alpha_1 \left(\frac{\pi_2^*}{\rho} + \frac{\mu}{\rho^2} \right) + I_2 \right) + \left(\frac{\pi_2^*}{\rho} + \frac{\mu + g_2 \lambda}{\rho^2} \right) \frac{\frac{\alpha_1 I_2}{\rho} - \frac{I_2}{\rho}}{I_2 + \frac{\pi_2^*}{\rho} + \frac{\mu}{\rho^2}} \right] \\ \left[\frac{\alpha_1 \left(\frac{\pi_2^*}{\rho} + \frac{\mu}{\rho^2} \right) + I_2}{I_2 + \frac{\pi_2^*}{\rho} + \frac{\mu}{\rho^2}} \left(\frac{\pi_2^*}{\rho} + \frac{\mu + g_2 \lambda}{\rho^2} \right) - C_2 - I_2 + W_0 \right]^{(\gamma-1)} \end{array} \right. \quad (27)$$

These two conditions of value-matching and smooth-pasting give :

First threshold relation π_1^* :

$$\frac{1}{\beta} \frac{\rho I_1^2 - I_1 \frac{g_1 \lambda}{\rho}}{(\rho I_1 + \pi_1^* + \frac{\mu}{\rho})^2} = \frac{1}{\gamma} \left[\frac{\rho I_1}{\rho I_1 + \pi_1^* + \frac{\mu}{\rho}} \left(\frac{\pi_1^*}{\rho} + \frac{\mu + g_1 \lambda}{\rho^2} \right) - C_1 - I_1 + W_0 \right] \quad (28)$$

Second threshold relation π_2^* :

$$\begin{aligned}
& \frac{1}{\beta} \left(\frac{1}{I_2 + \frac{\pi_2^*}{\rho} + \frac{\mu}{\rho^2}} \right) \left[\frac{1}{\rho} \left(\alpha_1 \left(\frac{\pi_2^*}{\rho} + \frac{\mu}{\rho^2} \right) + I_2 \right) + \left(\frac{\pi_2^*}{\rho} + \frac{\mu + g_2 \lambda}{\rho^2} \right) \frac{\frac{\alpha_1 I_2}{\rho} - \frac{I_2}{\rho}}{I_2 + \frac{\pi_2^*}{\rho} + \frac{\mu}{\rho^2}} \right] \\
= & \frac{1}{\gamma} \left[\frac{\alpha_1 \left(\frac{\pi_2^*}{\rho} + \frac{\mu}{\rho^2} \right) + I_2}{I_2 + \frac{\pi_2^*}{\rho} + \frac{\mu}{\rho^2}} \left(\frac{\pi_2^*}{\rho} + \frac{\mu + g_2 \lambda}{\rho^2} \right) - C_2 - I_2 + W_0 \right] \tag{29}
\end{aligned}$$

These two equation (28) and (29) are complex, we have to use a numerical solution to find the value of the critical profit flows that trigger the investment at each stage.

Thus, the optimal investment strategy is to invest as soon as the stochastic flows of the firm exceeds a threshold level. The trigger of the first investment is made when $\pi_t > \pi_1^*$ and the second investment is realized when $\pi_t > \pi_2^*$. These two threshold are determined by solving the two previous systems (27) and (28).

2.3 Numerical application

The aim of this sub section is to test the sensitivity of the threshold values π_1^* and π_2^* to the different parameters used in our model to show that these critical values are in conformity with the financial logic. Different parameters are varied to test the evolution of the critical profit flows¹².

As we show previously, the VC's risk aversion is a decreasing function of the parameter γ , i.e. when γ is high, the VC is less risk averse. The first figure (1) allows us to see the direction of the variation of the critical values π_1^* and π_2^* when the parameter of the relative risk aversion changes. This graphic shows that, when the risk aversion of the VC increases (thus, the parameter γ decreases) the threshold value that trigger the investment (or reinvestment) decreases, which means that the VC invests sooner in the firm to be financed when he is more risk averse. This can be explained by the fact that this kind of

¹²The value of parameters used in the numerical application are : $\gamma = 0,5$; $\mu = 0,05$; $\sigma = 0,3$; $\rho = 0,2$; $g_1 = g_2 = 0,01$; $\lambda = 1$; $I_1 = I_2 = 1$; $W_0 = 0,7$; $C_1 = 0,5$ and $C_2 = 0,3$.

investor prefers investing (or reinvesting) quickly so as to not lose the opportunity that is offered to him and not to risk the decrease in the value of the project.

The figure (2) shows that the threshold values π_1^* and π_2^* increase with the volatility. It's clear that a higher level of uncertainty means that the VC will wait a longer period before he invests (or reinvests) in the firm as it guarantees him a higher return on his investment. Indeed, a great uncertainty on the profit flows of the firm reduces the motivation of the VC to invest, which implies an increase in the critical values π_1^* and π_2^* . This positive relationship between the threshold value which triggers the investment and the volatility is in conformity with the results of Dixit and Pindyck (1994) (1994) [3].

The figure (3) shows that the threshold values which activates the investments are a positive function of the rate of return ρ required by VC. This shows that the waiting period of the VC before investing in the company is higher as ρ is large. Indeed, for a high level of the required rate of return, the VC requires a significant proceeds, which increases the value of the waiting option and delays the investment.

The negative relations between the threshold profit flows values and the growth rate, the intensity of the jump following the investment as well as the probability of the jump occurrence are illustrated in the graphs (4), (5) and (6). These graphs are in conformity with financial logic. In fact, when the parameter μ , g_1 , g_2 , λ_1 and λ_2 increase, the expected profit flows also increases, which gives more value to the investment and reinvestment opportunity and to the profits awaited by the VC from his investment in the risky project. The value of the waiting option will be lower, which encourages the VC to finance the company quickly as the profit flows become rapidly high.

The graphs (7), (9) and (8) show that the critical values π_1^* and π_2^* related to the investment and the reinvestment are very sensitive to the invested amounts I_1 and I_2 in each phase of investment as well as the initial wealth of the VC W_0 and the costs undergone by the VC (C_1 and C_2) in each stage of financing. As we can see, when costs ((I and C) increase (or

initial wealth drops) the expected profit flows of the company decrease and thus the project has a less value, the VC requires a higher level for profit flows before to be willing to grant funds to the firm (This relation between the costs and the threshold value is also shown by Dixit and Pindyck (1994) [3]).

3 Conclusion

In this paper, we considered decision-making investment of a venture capitalist who would like to finance a risky project in a sequential manner. This means of financing is largely adopted by the VC as it allows him to reduce his losses and eventual agency problems. Indeed, if the project's value decreases after the first investment, the VC can decide to stop his financing and not to allocate the remaining amount in a project that is not profitable.

The aim of this paper was to determine the different thresholds allowing the VC to receive a significant capital gain. We first study the ownership stake received by the VC at each stage of investment, and then we solved the dynamic programming in order to find the threshold value that trigger the investment. The VC's investment decision is as follow : at each stage, the VC invests in the firm if the expected flows of the project are higher than the critical value.

With a dynamic programming approach, we have determined the levels that trigger the VC's investment taking into account his risk aversion, the uncertainty about the future flows generated by the firm and the ownership stake given to the VC against his financing.

Our numerical results shows that, as expected (dixit and Pindyck (1994) [3]), the (uncertainty, the rate of return required by the VC, the level of investment, the cost raises the threshold values required to induce the VC to invest in the firm, which delays the investment decision. In the same way, the increase in the growth rate the profit flows, the intensity of the jump and the initial wealth reduce the opportunity cost of waiting, and induce the VC

to invest now rather than waiting.

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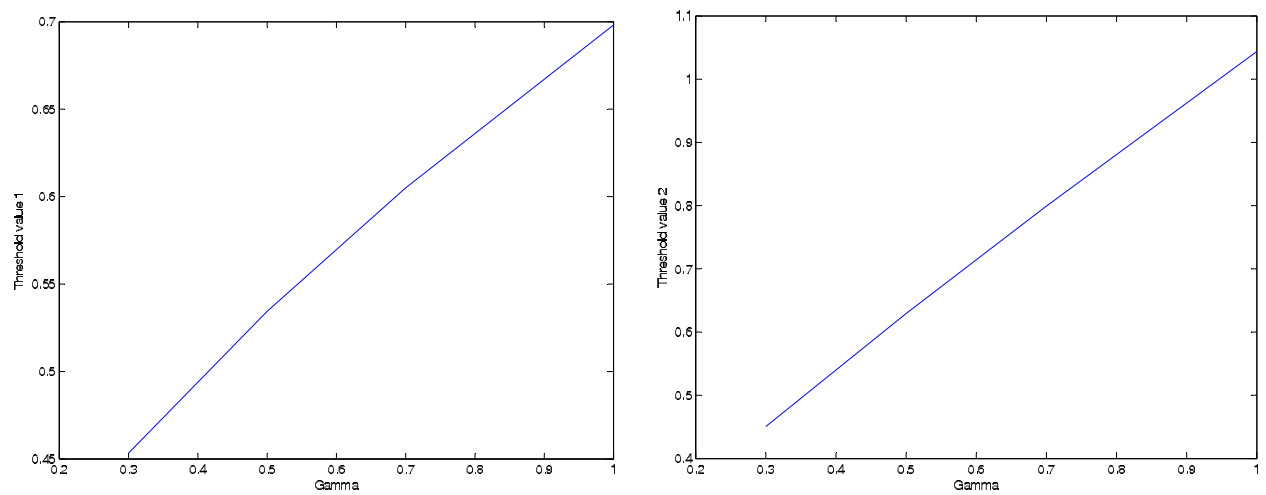


Figure 1: Sensitivity of the threshold value to the relative risk aversion parameter

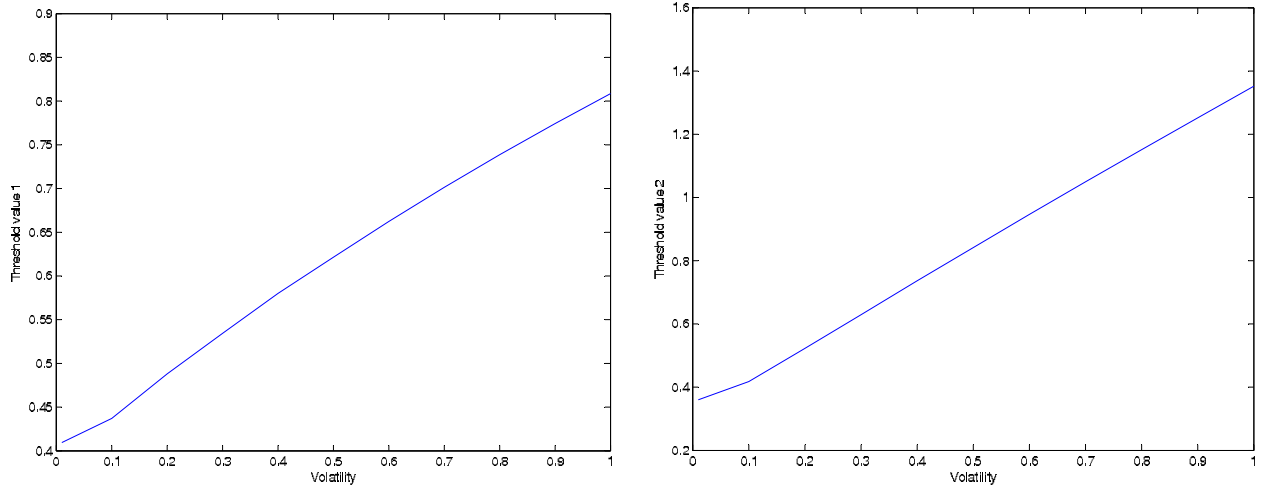


Figure 2: Sensitivity of the threshold value to the volatility σ

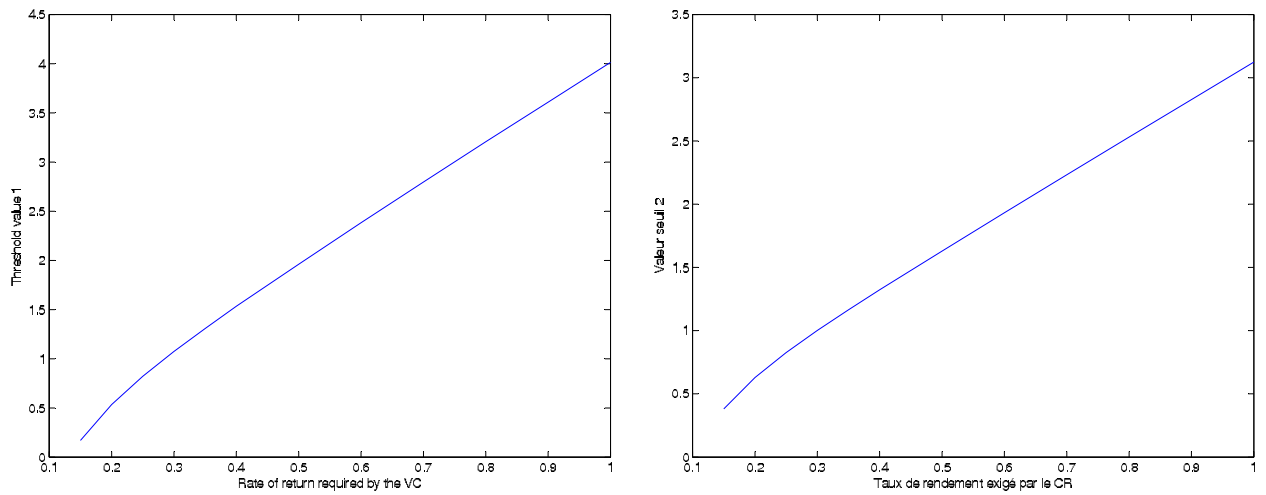


Figure 3: Sensitivity of the threshold value to the rate of return required by the VC ρ

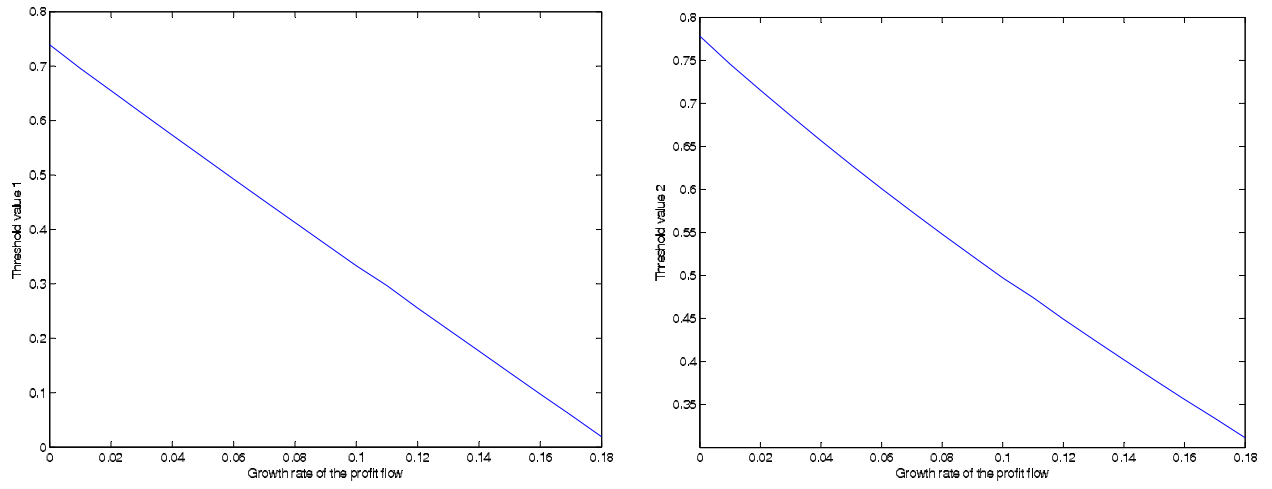


Figure 4: Sensitivity of the threshold value to the growth rate of the profit flows μ

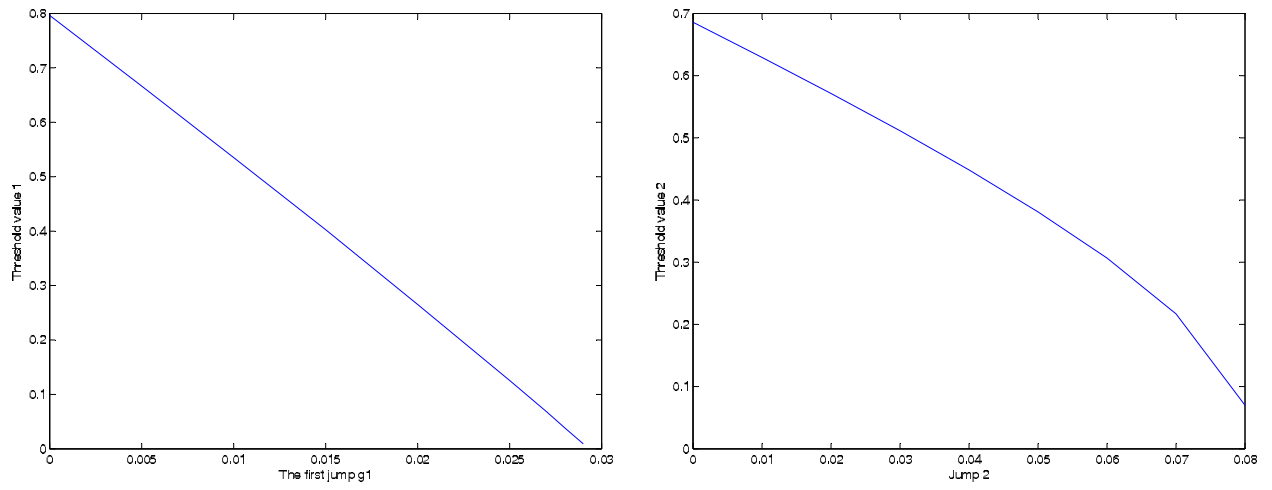


Figure 5: Sensitivity of the threshold value to the intensity of the jump

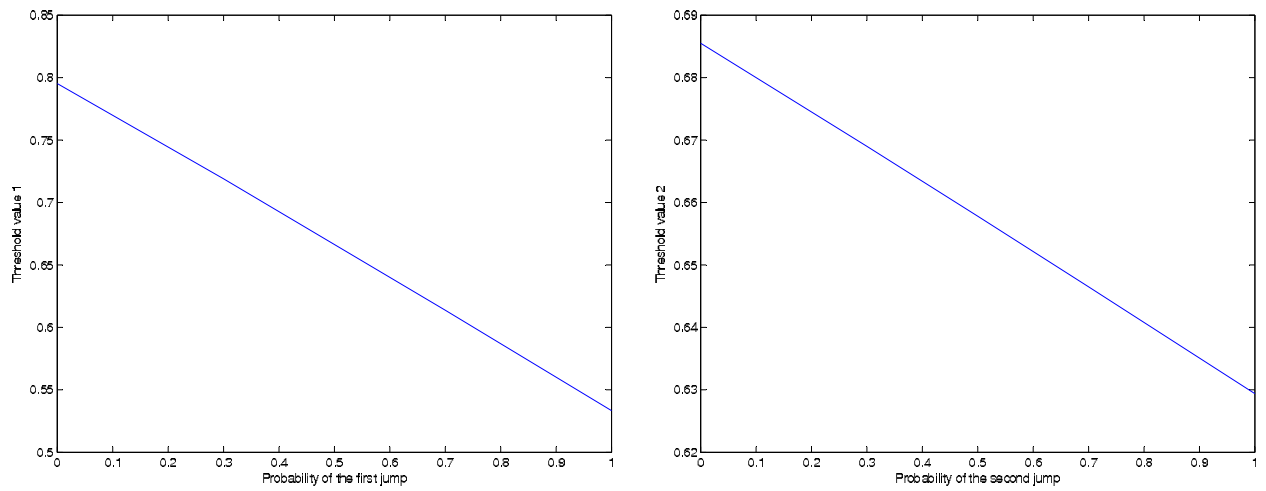


Figure 6: Sensitivity of the threshold value to the probability of the jump

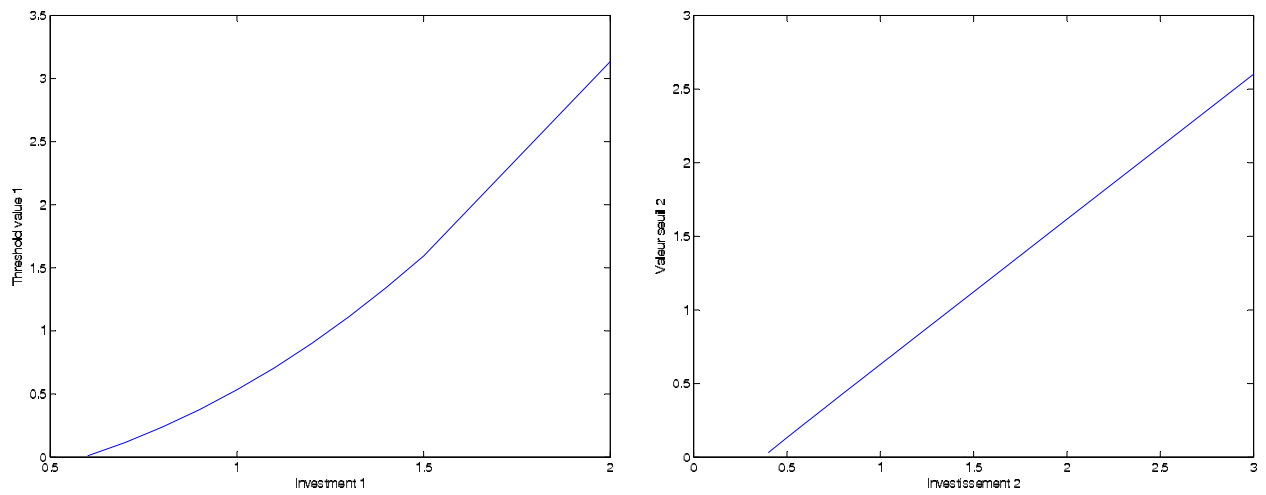


Figure 7: Sensitivity of the threshold value to the amount of investment

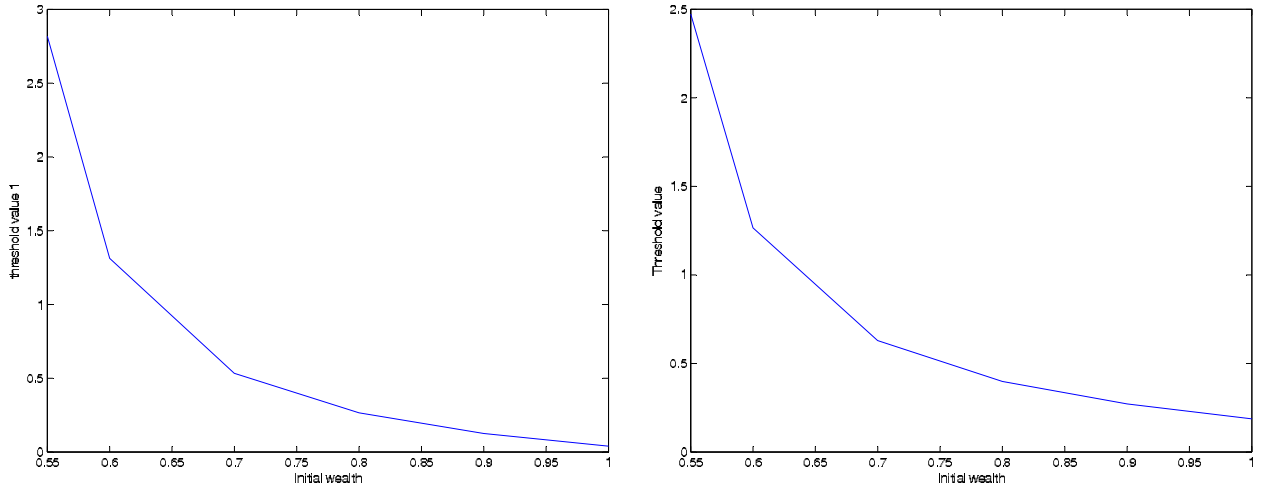


Figure 8: Sensitivity of the threshold value to the initial wealth of the VC W_0

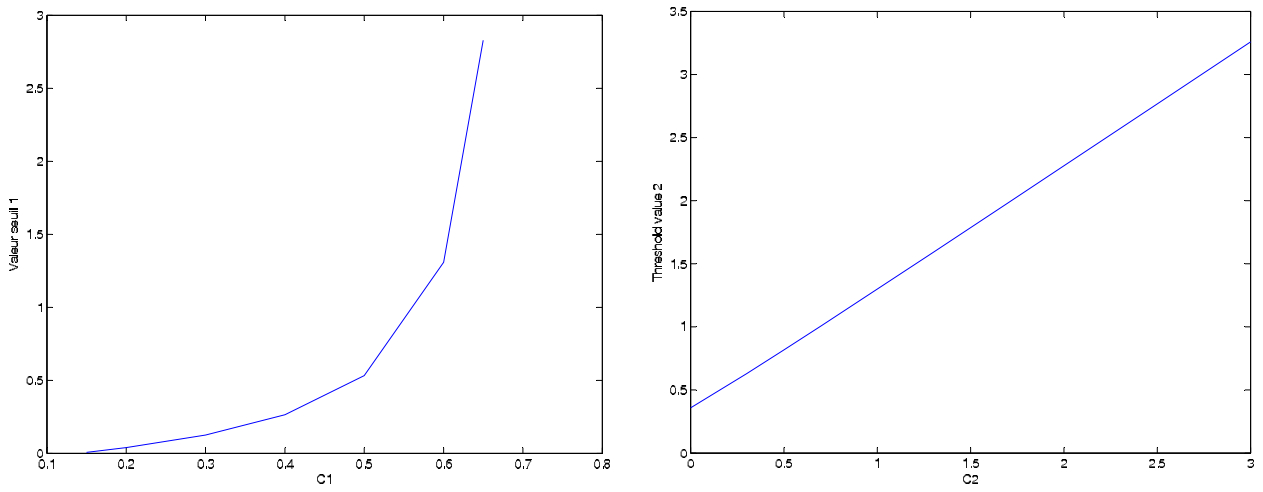


Figure 9: Sensitivity of the threshold value to the costs implied by the investment