

# IMPACT OF PROCESS INNOVATION ON ENTERPRISE NETWORKS FOR COMPETENCES EXCHANGE

## *E<sup>3</sup>, a Multi Agent based Model*

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**Abstract:** A business process is a set of logically related tasks performed to achieve a defined business and related to improving organizational processes. A process innovation can happen at various levels: incremental way, redesign of existing processes, totally new processes. The knowledge behind a process innovation can be shared, acquired, changed and increased by the enterprises inside a network. An enterprise can decide to exploit the innovative process it owns, thus potentially gaining competitive advantage, but risking, in turn, that other players could reach the same technological level. Or it could decide to share it, in exchange for other competencies or money. These activities could be the basis for a network formation and/or impact the topology of an existing network, by changing the number and topology of ties and links. In the present work an agent based model is introduced (E<sup>3</sup>), that aims to explore how a process innovation can facilitate network formation of existing enterprises, affect the network topology (e.g.: an enterprise owning an innovative process could become a focal point), induce new players to enter the market and spread onto the network by being shared or internally acquired by new players.

## 1 INTRODUCTION

Unlike product innovation, which is targeted towards product engineering, development and commercialization activities, process innovation relates to improving organizational processes. Our understandings of business process innovation come from the growing researches on organizational learning and knowledge management. The transfer and sharing of process innovation is not easy to attain, but information sharing/knowledge transfer (both within and across the boundary of the organization) is seen as an essential element for innovation. The network promote not only the transfer of knowledge (and the possible transfer of process) but also the creation of new knowledge as well, through synergies or competition. Within an organization, cross-unit knowledge transfer can produce “creative abrasion” (Leonard-Barton, 1995), generate “improvisational sparks” (Brown and Duguid, 1991) and create new information patterns by rearranging information already in use and incorporating information previously neglected (Isabella, 1990; Macdonald, 1995). Enterprises also actively look for external knowledge, for example

by expanding their networks to learn new practices and technologies (Kogut, 1988). The process innovation could impact on the network not only by improving the knowledge of the involved enterprises, but also by changing the number of actors (exit and entry), and changing the numbers and patterns of link information (Koka, 2006). The network can expand, churn, strengthen or shrink. At the level of a single enterprise, if it is the only one (or among the few) possessing an innovative process, it could become the focal point in a network, attracting others, wishing to link with it. Each network change is brought about by specific combination of changes in tie creation, tie deletion, and by changes in an actor’s portfolio size (number of link) and portfolio range (numbers of partners) (Koka et al. 2006). While Koka et al. (2006) present four types of network changes, they find that only an expanding network and a churning network are a reflection of a structural change, because new alliances are formed with new partners. An expanding network is brought about by an increase of new alliances without a deletion of old ones (meaning a large average of portfolio), together with an increasing portfolio range (more difference in

partners). A churning network reflects the formation of new alliances and the deletion of existing alliances. While the average portfolio remains stable in term of the number of partners, there is a rotation of partners.

In order to empirically study how process innovation can affect an enterprise network, an agent based model is used. Agent based simulation is an effective paradigm for studying complex systems. It allows the creation of virtual societies, in which each agent can interact with others basing on certain rules. In this way, a social system can be observed as if it were a laboratory study, by repeating the experiments all the needed times, and changing just some parameters, by leaving all the others still (*coeteris paribus* analysis), something that would be impossible in the real system. The agents are basic entities, endowed with the capacity of performing certain actions, and with certain variables defining their state. In the model presented here, the agents are reactive, meaning that they simply react to the stimuli coming from the environment and from other agents, without cognitively elaborating their own strategies. An agent based model consists of a multitude of software agents (both homogeneous or heterogeneous), each type being endowed with particular local properties and rules, put together within an environment, formally described as a set of parameters and rules. When the model is formally built and implemented, emergent results can be observed, thus inferring cause-effect relations by simulating different core scenarios.

In the present work, social network theory briefly is analyzed and a definition of process innovation is given. Then, the comprehensive agent based model used is formally introduced, and it is discussed how it can be employed to study how a process innovation affects an enterprise network. Last, some empirical results coming from the model are given and the future work in this direction is discussed.

## 2 SOCIAL NETWORKS

A social network is a social structure made of nodes (which are generally individuals or organizations) that are tied by one or more specific types of interdependency, such as values, visions, ideas, financial exchange, friendship. Social network analysis views social relationships in terms of nodes and ties. Nodes are the individual actors within the networks, and ties are the relationships between the actors. These concepts are often displayed in a social

network diagram, where nodes are the points and ties are the lines.

The idea of drawing a picture (called a “*sociogram*”) of who is connected to whom for a specific set of people is credited to Dr. J.L. Moreno (1934), an early social psychologist who envisioned mapping the entire population of New York City. Cultural anthropologists independently invented the notion of social networks to provide a new way to think about social structure and the concepts of role and position (Nadel, 1957; Mitchell 1969), an approach that culminated in rigorous algebraic treatments of kinship systems (White, 1963; Boyd, 1969). At the same time, in mathematics, the nascent field of graph theory (Harary, 1969) began to grow rapidly, providing the underpinnings for the analytical techniques of modern social network analysis. The strategic network perspective avers that the embeddedness of enterprises in networks of external relationships with other organizations holds significant implications for enterprise performance (Gulati, Nohria, and Zaheer, 2000).

Specifically, since resources and capabilities such as access to diverse knowledge (Burt, 1992), pooled resources and cooperation (Uzzi, 1996), are often acquired through networks of inter-firm ties, and since access to such resources and capabilities influences enterprise performance (Mowery, Oxley, and Silverman, 1996), it is important from a strategy perspective to examine the effect of network structure on enterprise performance (Gulati et al., 2000). Relationships between enterprises and their partners affect enterprises’ alliance-building, behaviour and performance (Ahuja, 2000; Almeida, Dokko, & Rosenkopf, 2003; Powell, Koput, Smith-Doerr, & Owen-Smith, 1999; Stuart, 2000). There is evidence that enterprises’ network positions have an impact on their survival (Baum, Calabrese, & Silverman, 2000), innovativeness (Ahuja, 2000), market share (Shipilov, 2005), and financial returns (Rowley, Behrens, & Krackhardt, 2000). However, evidence remains mixed on which particular patterns of inter-organizational relationships are advantageous for enterprises. One of the key ideas currently dominating the literature is Burt’s (1992) open network perspective, according to which an enterprise can obtain important performance advantages when exploiting relationships to partners that do not maintain direct ties among one another. The absence of direct ties among a firm’s partners (the presence of structural holes) indicates that these partners are located in different parts of an industry network, that they are connected to heterogeneous sources of information, and that their invitations to

jointly exploit business prospects present the focal enterprise with access to diverse deal-making opportunities (McEvily & Zaheer, 1999). Several studies have shown that enterprises improve their performance as a result of maintaining relationships (e.g., Finlay & Coverdill, 2000; Hargadon & Sutton, 1997), whereas other studies have shown negative performance effects of firms' maintaining positions in open networks (e.g., Ahuja, 2000; Dyer & Nobeoka, 2000).

### 3 PROCESS INNOVATION

A business process is a set of logically related tasks performed to achieve a defined business outcome (Davenport and Short, 1990), e.g.: sequencing of work routines, information flow and so on.

Process innovation is defined as "*the introduction of a new method of production, that is, one yet tested by experience in the branch of manufacture concerned a new way of handling a commodity commercially*" (Shumpeter 1911). Archibugi et al. (1994) and Edquist et al. (2001) define process innovation like the result in a decrease in the cost of production. The drivers of process innovation are primarily reduction in delivery lead time, lowering of operational costs, and increase in flexibility (Boer and During 2001): process innovations are a firm's new way of design or manufacturing existing or new products. While newness on product innovation is defined at a macro level (market, industry), newness of process innovations is often defined at a micro level (enterprise and business unit).

Meeus and Euis divide process innovations into two categories: *technological* and *organizational* innovations: technological process innovations change the way products are produced by introducing change in technology (physical equipment, techniques, system); organizational innovations are innovations in an organization's structure, strategy and administrative processes (Damanpour 1987).

Process innovation can and should happen at various levels within the organization as no organization can depend solely upon innovation occurring at one level only. Successful organizations have an innovation process working its way through all levels of the organization.

### 4 IMPACT ON THE NETWORK

Process innovation is a key factor for both competing in a market and creating links with other players. An enterprise owning a proprietary process would in fact exploit it, by gaining a competitive factor over those who do not possess it. On the other hand, it could decide to share it with other enterprises in exchange for money or, even better, in exchange for other competencies it does not know. This is the most important factor behind the creation of what we here define "*network for competences exchange*", i.e.: a social network of enterprises, where the ties semantically represent a synergy among players exchanging process innovations or, to a more general extent, competences.

Philippen and Riccaboni (2007) in their work on "radical innovation and network evolution" focus on the importance of local link formation and the process of distant link formation. Regarding the formation of new linkages Gulati (1995) finds that the process of new tie creation is heavily embedded in an actor's existing network. This means that new ties are often formed with prior partners or with partners of prior partners, indicating network growth to be a local process. Particularly when considering inter-firm alliances, new link formation is considered "risky business" and actors prefer alliances that are embedded in a dense clique were norms are more likely to be enforceable and opportunistic behaviour to be punished (Gulati, 1995; Powell et al., 1996; Koka et al., 2006, Granovetter, 1985). Distant link formation implies that new linkages are created with partners whom are not known to the existing partners of an actor. At the level of the enterprise, (Burt 1992) shows that distant linkage that serve as bridge between dense local clique of enterprises, can provide access to new source of information and favourable strategic negotiation position, which improves the firms' position in the network and industry.

In order to examine and study how a process innovation can spread and affect the network for competences exchange, an agent based model is used. The model is a comprehensive one, showing the network dynamics for enterprises, and is described in detail in the next paragraph.

### 5 THE E<sup>3</sup> AGENT BASED MODEL

The model has been developed at the *e-Business L@B*, University of Turin. It is built in pure *Java*, thus following the *Object Oriented* paradigm. This is

particularly suitable for agent based modelling, since the individual agents can be seen as objects coming from a prototypal class, interacting among them basing on the internal rules (methods). While the reactive nature of the agents may seem a limitation, it's indeed a way to keep track of the aggregate behaviour of a large number of entities acting in the same system at the same time. All the numerical parameters can be decided at the beginning of each simulation (e.g.: number of enterprises, and so on).

Everything in the model is seen as an agent; thus we have three kinds of agents: Environment, Enterprises and Emissaries ( $E^3$ ). This is done since each of them, even the environment, is endowed with some actions to perform.

### 5.1 Heat Metaphor

In order to represent the advantage of an enterprise in owning different competences, the "heat" metaphor is introduced. In agent based models for Economics, the metaphor based approach (Remondino, 2003) is an established way of representing real phenomena through computational and physical metaphors. In this case, a quantum of heat is assigned for each competence at each simulation turn. If the competence is internal (i.e.: developed by the enterprise) this value is higher. If the competence is external (i.e.: borrowed from another enterprise) this value is lower. This is realistic, since in the model we don't have any form of variable cost for competencies, and thus an internal competence is rewarded more. Heat is thus a metaphor not only for the profit that an enterprise can derive from owning many competences, but also for the managing and synergic part (e.g.: economy of scale).

Heat is also expendable in the process of creating new internal competences (internal exploration) and of looking for partner with whom to share them in exchange of external competences (external exploration). At each time-step, a part of the heat is scattered (this can be regarded as a set of costs for the enterprise). If the individual heat gets under a threshold, the enterprise ceases its activity and disappears from the environment.

At an aggregate level, average environmental heat is a good and synthetic measure to monitor the state of the system.

### 5.2 Environment

The environment is regarded as a meta-agent, representing the world in which the proper agents

act. It's considered an agent itself, since it can perform some actions on the others and on the heat. It features the following properties: a grid (X,Y), i.e.: a lattice in the form of a matrix, containing cells; a dispersion value, i.e.: a real number used to calculate the dissipated heat at each step; the heat threshold under which an enterprise ceases; a value defining the infrastructure level and quality; a threshold over which new enterprises are introduced; a function polling the average heat (of the whole grid). The environment affects the heat dispersion over the grid and, based on the parameter described above, allows new enterprises to join the world.

### 5.3 Enterprise Agents

This is the most important and central type of agent in the model. Its behaviour is based on the reactive paradigm, i.e.: stimulus-reaction. The goal for these agents is that of surviving in the environment (i.e.: never go under the minimum allowed heat threshold). They are endowed with a heat level (energy) that will be consumed when performing actions. They feature a unique ID, a coordinate system (to track their position on the lattice), and a real number identifying the heat they own. The most important feature of the enterprise agent is a matrix identifying which competences (processes) it can dispose of. In the first row, each position of the vector identifies a specific competence, and is equal to 1, if disposed of, or to 0 if lacking. A second row is used to identify internal competences or outsourced ones (in that case, the ID of the lender is memorized). A third row is used to store a value to identify the owned competences developed after a phase of internal exploration, to distinguish them from those possessed from the beginning. Besides, an enterprise can be "settled", or "not settled", meaning that it joined the world, but is still looking for the best position on the territory through its emissary. The enterprise features a wired original behaviour: internally or externally explorative. This is the default behaviour, the one with which an enterprise is born, but it can be changed under certain circumstances. This means that an enterprise can be naturally oriented to internal explorative strategy (preferring to develop new processes internally), but can act the opposite way, if it considers it can be more convenient. While in the present model the agents are stochastic (with a different probability distribution decided at the beginning of the simulation for the two agents' classes), cognitive agents will be added shortly,

using reinforcement learning techniques to optimize their behaviour and make it more realistic.

Finally, the enterprise keeps track of its collaborators (i.e.: the list of enterprise with whom it is exchanging competencies and making synergies) and has a parameters defining the minimum number of competencies it expects to find, in order to form a joint. The main goal for each enterprise is that of acquiring competences, both through internal (e.g.: research and development) and external exploration (e.g.: forming new links with other enterprises). The enterprises are rewarded with heat based on the number of competences they possess (different, parameterized weights for internal or external ones), that is spread in the surrounding territory, thus slowly evaporating, and is used for internal and external exploration tasks.

#### 5.4 Emissary Agents

These are agents that strictly belong to the enterprises, and are to be seen as probes able to move on the territory and detect information about it. They are used in two different situation: 1) if the enterprise is not settled yet (just appeared on the territory) it's sent out to find the best place where to settle. 2) If the enterprise is already settled and chooses to explore externally, an emissary is sent out to find the best possible partners. In both cases, the emissary, that has a field of vision limited to the surrounding 8 cells, probes the territory for heat and moves following the hottest cells. When it finds an enterprise in a cell, it probes its competencies and compares them to those possessed by its chief enterprise verifying if these are a good complement (according to the parameter described in the previous section). In the first case, the enterprise is settled in a cell which is near the best enterprise found during the movement. In the second case, the enterprise asks the best found for collaboration). A link is created among two enterprises if at least one competence may be exchanged among them. Be  $CM(a)$  the competences missed by enterprise  $a$ , and  $CM(b)$  those missed by enterprise  $b$ , the exchanged number of competences will be the minimum between  $CM(a)$  and  $CM(b)$ . The strength of the link among two enterprises will be proportional to the number of exchanged competences, and will vary during the simulation (e.g.: after enterprise  $a$  acquires a new competence that  $b$  is missing and vice versa). While moving, the emissary consumes a quantum of heat, that is directly dependant on the quality of infrastructures of the environment.

#### 5.5 Main Iterations

The main iterations for the simulation model are described in this section.

At step 0, a lattice is created  $(X, Y)$ . A number  $n$  of enterprises are created,  $k$  of them internally explorative and  $n-k$  of them externally explorative.  $X$ ,  $Y$ ,  $n$ , and  $k$  are set by the user, before the simulation starts.

At step 1, the environment checks if some enterprise reached the minimum heat threshold; if so, removes it from the world. After that, each enterprise, if idle (not doing anything) decides what behaviour to follow.

At step 2, all the enterprises that selected to be EE move their emissary by one cell. All the IE ones work on the R&D cycle (one step at a time).

At step 3, the EE enterprises check if the emissary finished its energy and, in that case, ask the best found enterprise for collaboration (they can receive a positive or negative reply, based on the needs of the other enterprise). The IE enterprises check if R&D process is finished and, in that case, get a competence in a random position (that can be already occupied by an owned competences, thus wasting the work done).

At step 4, the environment scatters the heat according to its parameters. Loop from step 1.

#### 5.6 Parameters in the Model

At the beginning of a simulation, the user can change the core parameters, in order to create a particular scenario to study. Some of the parameters are constituted by a scalar value, others are in percentage, others are used to define stochastic (normal) distributions, given their mean value and their variance. Here follows a synthetic explanation for the individual parameters:

*Maximum number of steps:* is the number of iterations in the model. 0 sets the unbounded mode

*Initial number of enterprises:* is the number of enterprise agents present at start-up (0 is random)

*Initial heat for enterprise:* a normal distribution setting the initial energy for each enterprise, given the mean and the variance

*Number of competences:* the length of the vector, equal for all the enterprises (metaphorically representing the complexity of the sector in which they operate)

*Competences possessed at start-up:* a normal distribution referring to how many processes an enterprise owns internally, given the mean and the variance

*Threshold for new enterprise to enter the market:* a delta in the average heat of the world, after which a new enterprise is attracted in the market

*Infrastructure quality:* affects the cost of external exploration

*Minimum heat threshold:* level under which an enterprise cease

*Minimum percentage of competences to share for link creation:* when asked for a competences exchange, the other enterprise looks at this value to decide whether to create a link or not

*Emissary step cost:* percentage of the heat possessed by the enterprise spent for each step of its emissary, during external exploration task

*Internal exploration duration:* quantity of steps for internally developing a new competence

*Internal exploration cost:* percentage of the heat possessed by the enterprise spent for each step of internal exploration

*Environment control cycles:* quantity of steps for sampling the average heat of the environment

*Heat dispersion index:* percentage of heat evaporated at each step

*Lattice dimension:* the dimension of the grid hosting the enterprise (i.e.: the whole environment)

*Internal Exploration cost:* una tantum cost for setting up an emissary for external exploration

*Propensity to External Exploration for new enterprises:* when a new enterprise enters the market, it looks at the average number of links in the network. If more than this value, it behaves as externally explorative, otherwise internally explorative

*Number of initial enterprises doing external exploration:* variable to divide the initial behaviour

*Value of internal/external competence:* reward (heat) given for each internal/external competence possessed

## 6 QUALITATIVE RESULTS

While the main object of this paper is to present the model itself as a tool for studying the effects of process innovation on enterprise networks, in the present paragraph some insights will be given about preliminary results obtained from the model itself. The presented ones will be mainly qualitative results, although the model can give many quantitative individual and aggregate results. In particular, a “*computational only*” mode is present in the model, allowing it to perform a *multi-run* batch execution. This is done according to the theory presented in Remondino and Correndo (2006): the

model is executed a defined number of times (chosen by the user) and the different outputs are sampled and collected at every  $n$  steps (again,  $n$  decidable by the user) with the same parameters (in order to overcome sampling effects that could be caused by stochastic distributions) or by changing one parameter at a time by a discrete step, in order to carry on a *coeteris paribus* analysis on the model.

While this kind of analysis will be discussed in detail in future works, here some qualitative and semi-quantitative outputs will be discussed, obtained from the model. The model can give the following different kinds of outputs, when running in “*normal*” mode: 1) a real-time graph, depicting the social network, in which the nodes are the enterprises, whose colour represent the behaviour they are following at a given step, and the links are the ties indicating two or more enterprises mutually exchanging one or more competences. 2) A set of charts, showing in real time some core parameters, namely: *average heat in the environment*, *number of links (in the network)*, *number of links (average)*, *number of enterprises doing internal exploration*, *number of ceased enterprises since the beginning*, *number of born enterprises since the beginning*, *number of available competences (overall)*, *total number of skills possessed at the beginning*, *obtained by external exploration*, *obtained by internal exploration*.

In figures 1, 2 and 3, the output graph is depicted at times 0 (no links), 100 and 500. These pictures belong to the same simulation, so the parameters are the same for all of them, with the only variation of time, giving a hint about the development of the enterprise network. In figure 1 the initial state of the network is shown, where no ties have been created, yet. A total of 20 enterprises is on the territory, 10 of which have an internally explorative behaviour and the other 10 have an externally explorative mood. Internal competences are rewarded 10% more than external ones, but internal exploration strategy (e.g.: research & development) is 30% more expensive.

After 100 steps (figure 2) some new players have entered the market (an average of 1 new enterprise each 10 steps), meaning that the average heat of the system increased significantly; this can be thought as a starting network, attracting new players thanks to a good overall balance. Some ties have formed and many new competences (the dimension of enterprises) have been internally produced.

After the initial steps in which 50% of the enterprise was doing internal exploration, now at the 100<sup>th</sup> step, only one third (i.e.: 33%) is doing that, since almost all the smaller players are trying to

outsource them from the bigger ones, in order to gain some energy.

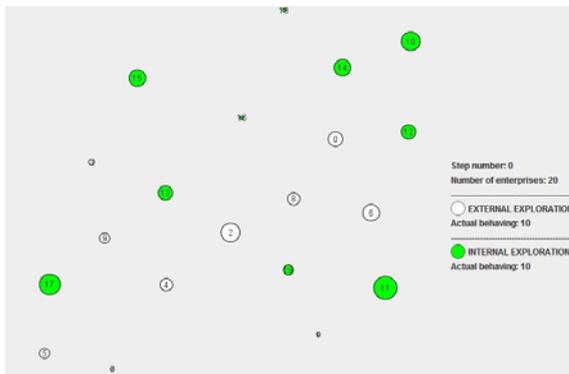


Figure 1: The network at time 0.



Figure 2: The network at time 100.

Unfortunately, many of these small enterprises have no competence to give to the bigger one in exchange for theirs. They will eventually die (ceased enterprises) or try to change strategy, by starting an internal exploration. That's why at time 500 (figure 3) the total number of players increased again, but at a lower rate (1 every 15 steps, as an average) and now, in percentage, most of the survived enterprises are doing external exploration (62% circa) and have become quite big (many internal competences possessed). Notice that in this experiment the threshold under which an enterprise must cease is a low value, meaning that few of them have to leave the market. This was done intentionally to show how enterprises can react and adapt their behaviour even if they are modelled as reactive agents.

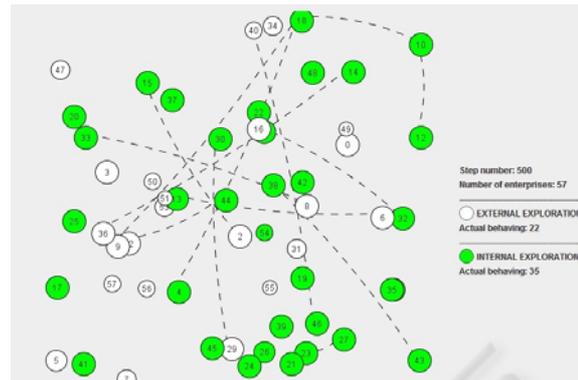


Figure 3: The network at time 500.

## 7 CONCLUSIONS AND OUTLOOK

Process innovation is characterized by two important aspect: one critical and typical aspect is the ability to gather, develop and transform information and knowledge in a potential competitive advantage. The second aspect regards spending resources like time and money: the development of process innovation is usually time and resource consuming and is difficult to attain, especially when referring to radical cases. Though, process innovation is a key factor for building a network for competences exchange and a very important variable when considering the strategies performed by an enterprise; once possessed, the advantage can be exploited or shared. In the first case, the enterprise can gain customers and money, by being the only one (or among the few ones) possessing it. But it risks to lose its advantage as soon as other players can develop it. Another strategy is that of sharing the process innovation, in exchange for other competencies and/or money.

An agent based model is introduced in this work, aiming at capturing the dynamics behind the creation and the following modifications of an enterprise network for competences exchange, i.e.: a network in which enterprises can internally develop and/or share processes with other players. This is, by the way, one of the focal points behind the creation of industrial districts, enterprise clusters and so on. A well established network of this kind can attract new players, that will probably bring new knowledge and competences in it.

The model is formally discussed in detail, and so the agents composing it and its iterations. While studying quantitative results is beyond the purpose of this work, a qualitative analysis is described, and

the network graph, one of the graphical outputs supplied by the model, is analyzed: in order to show how network dynamics emerge from the model and its parameters, settable by the user.

At the beginning, when the enterprises have few competences and high perception of how can be difficult develop and innovation process, they try to link with the enterprises that have already developed innovative processes. That's why, in an initial phase, the number of enterprises doing external exploration tends to increase. After some steps, the number of enterprises choosing external exploration is lower and lower and limited to the smallest players, or the newly arrived ones. The reason is that at the beginning, the enterprise's capability are low and the perception of the effort for developing a process innovation is high. The enterprise at this phase typically try to share and exchange competences with others that have already developed the innovative process, not having to face the risk of inside developing, even if this can be more gainful in the long run. As time passes by, the enterprises start to become bigger and be more conscious about their capabilities and knowledge, thus reducing the perception of the effort to develop innovative processes internally.

The model is comprehensive and its scope is wide. In future works other features will be described in detail, and quantitative analysis will be carried on in order to study real-world cases (e.g.: existing industrial districts and so on) and the underlying dynamics that lead to their creations.

Besides, a new feature will be implemented in the model, referred to as "shock mode", allowing the user to stop the model at a given step, and change some inner parameter. For example, it will be possible to add a specific competence to one enterprise only, so that it's the only one in all the network possessing it. In that way it becomes possible to study how and based on which dynamics this specific competence spreads on the network and which kind of competitive advantage it gives, in terms of central position in the network and bargaining power to obtain other competences not possessed internally.

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