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Abstract:	Studies refer to Heuristics and Evidences Decision Making approaches in a comparative manner, however it is identified that these two approaches are inseparable and are applied in parallel. The objective of this paper is to provide a qualitative analysis of a systems thinking framework that defines a transition path from either a heuristic dominated or evidence-based dominated decision making approach to a balanced one. The aims are to demonstrate the stages of change and prepare managers and executives for the resistance that will be evident during the transition. We do not claim that this is the only path of change, however it provides a structured model that can be repeated under similar context. We use abductive reasoning in order to make logical inferences and construct the framework's theory based on a case study company, and then system dynamics that help us proceed to the modeling approach of this framework. The holistic modeling approach reveals the need to base decision making in both evidence and heuristics. Furthermore, it demonstrates actions to manage resistance and to make this system a self-regulated and continuous decision-making tool.
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Heuristics and Evidences Decision (HeED) Making: A case study in a systemic model for transforming decision making from heuristics-based to evidenced-based

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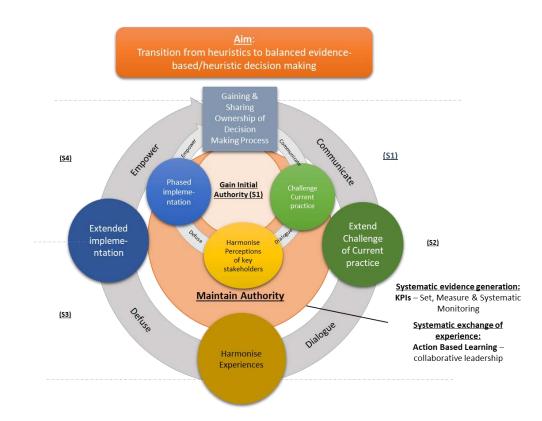


Figure 1. The generic HeED model.

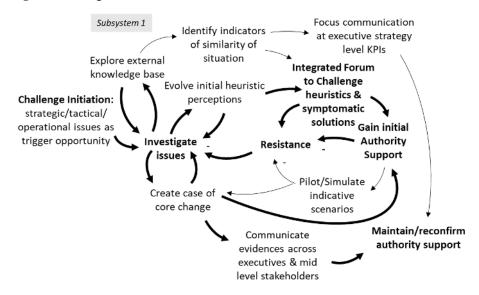


Figure 2. Communicate initiative and challenge initial heuristics subsystem

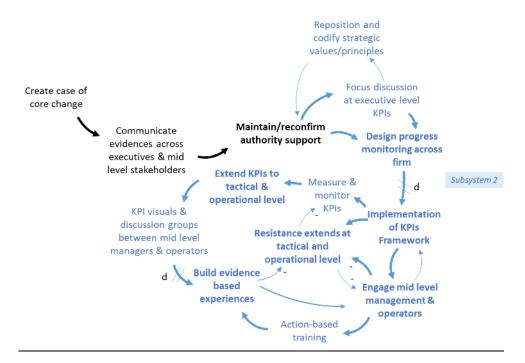


Figure 3. Extend dialogue and evidence building subsystem.



Figure 4. Expanded implementation at operational level

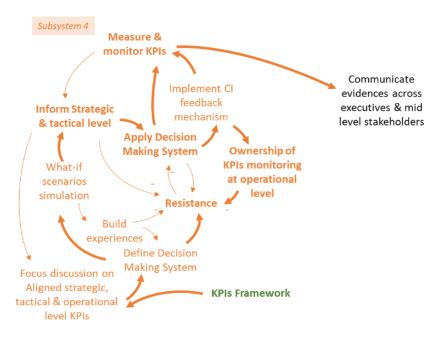


Figure 5. Empowering implementation of Systemic Decision Making Process Subsystem

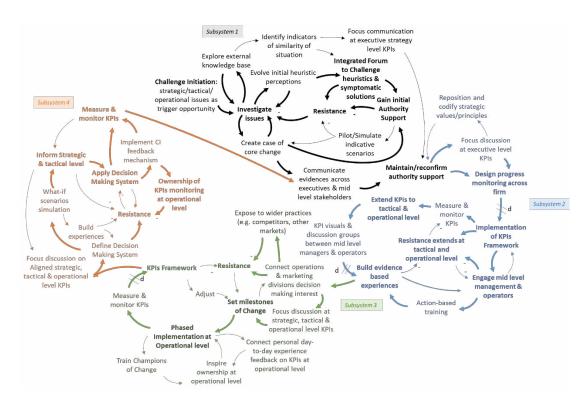


Figure 6. The overall HeEd systemic logic

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Abstract

Studies refer to Heuristics and Evidences Decision Making approaches in a comparative manner, however it is identified that these two approaches are inseparable and are applied in parallel. The objective of this paper is to provide a qualitative analysis of a systems thinking framework that defines a transition path from either a heuristic dominated or evidence-based dominated decision making approach to a balanced one. The aims are to demonstrate the stages of change and prepare managers and executives for the resistance that will be evident during the transition. We do not claim that this is the only path of change, however it provides a structured model that can be repeated under similar context. We use abductive reasoning in order to make logical inferences and construct the framework's theory based on a case study company, and then system dynamics that help us proceed to the modeling approach of this framework. The holistic modeling approach reveals the need to base decision making in both evidence and heuristics. Furthermore, it demonstrates actions to manage resistance and to make this system a self-regulated and continuous decision-making tool.

Key Words: Heuristics, Evidence-based decision making, Change Process, Resistance to
DynamicsResistance to
Modeling

Introduction

A decision making activity is considered as a managerial action mostly under the control of the organization (Elbanna and Child 2007), even though a complicated and challenging one (Parnell et al. 2011). Literature implies that individuals make their business decisions mainly depending on the risk levels of each decision (Min and Chuna 2019), while managers and executive teams often fail when making strategic decisions due to the fact that these decisions are both complex and ill-structured (Carmeli et al. 2012). Actually, the decision makers in the manufacturing sector are usually confronted with the problem of making a decision through a wide range of alternative options (Venkata 2007). Taking into consideration the complexity and the risk of decision making process, literature reveals several modeling approaches used in order to assess the risks and probabilities associated with decision processes (Lindley 2000: 293; Nutley and Davies 2000; Sarasin 1999). In this paper we study two literature approaches to decision making, namely the evidence-based and the heuristics, and how these two approaches often bring conflict and resistance among the executives, managers and employees. Literature refers to these methodologies identifying their positive and negative points and quite often to their comparison (Gigerenzer et al. 1999). What is identified as a literature gap, is that in practice these two approaches are inseparable and are applied in parallel. According to Pachur and Forrer (2013), these two approaches can mutually interact towards a better understanding of contingent nature in decision making. Our article deals with this gap by providing a systems thinking approach to build an analytical framework, based on a case study company.

Evidence-based decision making (EBDM) is a practice of making decisions which consolidates the most efficient available research evidence with the decision maker's personal competences and the employee/customer's preferences (Vishwanath and Farimah 2012). Rousseau (2012) considers evidence-based management as a process that demarcates principles from research data and translates them into practices that may help solving organizational issues and make decisions. Tranfield et al. (2003) consider EBDM as a switch from traditional narrative approaches to systematic evidence-sensitive procedures. This process aims at leading the decision making practice to the direction of more effective outcomes for the organization (Sackett et al. 2000). The main focus on the EBDM is the form of the actual 'evidence'. Regarding this specific matter, Sherman (2002) considers that evidence may be categorized according to a weak-to-strong scale, based on specific scientific rules. EBDM in the form of naturalistic decision making (NDM) describes how practitioners actually make decisions in complex domains such as organizational management or investment programs based on evidence (Shattuck and Miller 2006). According to Julnes and Holzer (2001) the process of EBDM requires at least two crucial approaches: the first one considers that evidence-based decision making should be embedded into the organization in such a way that may capitalize value and embrace evidence application over intuition in implementing organizational strategies. Such an approach allows individuals to make effective and timely decisions (LaValle et al. 2010). The second approach comprises a coordinated procedure of sequential evidencebased actions in which an organization clusters, processes and uses evidence in the forms of data. If evidence is not collected, subsequently organizations are not capable of analyzing information in order to make proper decisions. Correspondingly, if evidence is not analyzed at a frequent and efficient way, employees and managers may be drifted towards incorrect decisions. Moreover, evidence in specific forms such as statistical formats, has a significant impact on improving EBDM in terms of time required and accuracy of decisions (Arribas et al. 2014) but if the results of evidence analysis are not fully incorporated into decision making, it may lead to a severe loss of financial and organizational resources (Julnes and Holzer 2001). Finally, Rousseau (2018) further categorizes EBDM into three major decision processes, the 'routine decisions' for clear cause-effect understanding, the 'non-routine decisions' for complicated decisions for which their information is existent but not currently available to the decision maker and the 'truly novel decisions' which require critical but currently non-existent information.

On the other side, heuristics are considered as general decision making strategies based on limited information, which, however, are often proven to be correct (Shah and Oppenheimer 2008). Krabuanrat and Phelps (1998) characterize heuristics as procedures for taking decisions made by individuals or the organization in total, in the course of experience. When information gathering costs are high, individuals tend to rely on non-compensatory heuristics (Bröder_and Schiffer 2006; Pachur and Forrer 2013). Amongst several key facets to understand knowledge management, heuristics may be considered the comprehension of specific values of space, time and passion (Friedman and Prusak 2008). Moreover, Tversky and Kahneman (1974) consider three basic types of heuristics - representativeness, availability and adjustment - as the core means to be applied at most heuristic-based decisions. Furthermore, representativeness heuristic can be considered as a 'gambling' procedure that makes predictions, having as known prerequisites the functional form and the parameters of the underlying process (Krawczyk and Rachubik 2019). Walumbwa et al. (2014) view heuristics decision making (HDM), as a decision making type seeking to maximize justification of the decision while minimizing cognitive effort. The core of HDM is that there is no optimal solution to problems, but heuristics may be used as 'mental short cuts', in order to make good enough decisions. Moreover, according to Eastwood et al. (2012) it is possible that individuals will be choosing heuristic approaches on occasions when a decision must be made directly and related information is difficult to obtain. Heuristics approaches deescalate the cognitive burden regarding decision making (Shah and Oppenheimer 2008) and they may be considered a primary source of competitive advantage (Krabuanrat and Phelps, 1998). Gigerenzer (2001) assumes that HDM allows fast and frugal decisions that may be easily comprehended by most individuals and can be applied to new situations, specific types of problems and particular environments. Moreover, Busenitz and Barney (1997) claim that in case of environmental uncertainty and complexity, heuristics can be an effective and efficient guide to decision- making, as well as that the use of heuristics has been found to be associated with innovativeness. Furthermore, the heuristics decision making process includes views and capabilities of making decisions based on predictions, without taking plain cognitive data into consideration. Schuldt et al. (2017) mention that people performing analytical tasks must also be able to predict and express the possibility that their plans and estimates are correct and they will succeed. However, regarding heuristics known processes there is not an absolute factor theory that can fully explain the cognitive biases that a heuristics-based decision contains (Svensson et al. 2018).

Literature review often refers to the comparison of these two decision making methods. Evidence-based decision makers consider HDM as a tool useful for daily interactions where quick decisions are required under a limited set of data available (Gigerenzer et al. 1999). In fact, HDM operates as a mean to a prototypical representation of a decision, by creating a decision based on memory-bin representations from previous experiences rather than a decision based on the actual evidence of the current condition (Wyer and Srull 1986). Moreover, empirical literature has shown that heuristics are used only by a fraction of subjects, and only in certain situations (Bröder and Schiffer 2006; Pachur et al. 2008). Furthermore, Martin and Moon (1992) proved in their experimental study that a "partial-knowledge" framework in the case of price distribution is a far more effective decision making approach in comparison to a "no-knowledge" heuristics approach, emphasizing the significance of evidence at a medium level at least. Other authors consider HDM as a decision making process that is not processing the information objectively (Hofmann 2015), while others emphasize that heuristics can transform and even deform decision (Weber 2019). Taking into consideration these arguments, it is significant to consider a mixed decision making model that may combine the speed of HDM at specific managerial aspects that previous experience plays a crucial role, with an EBDM that may be applied at circumstances where detailed analysis of data and situations/procedures is required. Yilmaz and Daly (2016) in their paper suggest also this combination, by examining evidence for design heuristics in the creation of multiple design concepts.

Therefore, the objective of this paper is to demonstrate in practice the process of initiating a balanced decision-making approach, coupled approach between Heuristics and Evidence-Based Decision process, considering the different levels of hierarchy and resistance to change that are typical in a manufacturing firm. In order to switch from each one of the two different decision-making approaches to a balanced one, we study the process of change and how this is applied to a case company. The case company is a manufacturing company based in the Middle East, operating in diversified sectors within the healthcare industry¹. The core operations of the firm are as a developer and producer of brand-generics, the Company's mission is to enable quality healthcare for all people, through diversified and innovative contributions to the global healthcare industry.

According to Buono and Kerber (2010), change capacity is the ability of a firm to change more than once, making change a canonical response to changes in the firm's external environment while regarding firm's change performance, that index may refer to multiple organizational aspects such as the level of attainment of the change objectives and catching deadlines (Raineri 2011). Relevant studies have indicated that organizations successfulness is directly related to organization's change capability, regarding their change projects' performance (Teece et al. 1997). According to the conventional change management literature, there are multiple alternative perspectives on resistance to change that may be applied to both evidence-based and heuristics decision making and appear on strategic, tactical and operational level. Piderit (2000) considers change is too simplistic to actually reflect the complicated reality of employee's responses to change challenges at all levels.

Taking all the above concepts into consideration, the contribution of our research is twofold. First, we contribute to a literature discussion concerning the importance of linking the two decision-making methods, HDM and EBDM, in order to create a new approach, a balanced evidence-based and heuristics decision making (coupled approach between Heuristics and Evidence Decision – named HeED), that would cover the disadvantages of each method when applied separately. Second in order to do so, we provide a qualitative analysis of the holistic modeling approach to the balanced decision making concept, in order to reveal the resistance that the authority will experience during the transition and propose actions to defuse that resistance. The modeling approach is based on the system dynamics (SD) theory and constitutes a tool for the analysis of relations between the stages of change. This framework is constructed by taking an experimental approach, observing and debating the operations and proposed changes in a case firm, namely here as MiddlePharma, which faces issues in its supply chain, manifesting in the form of sales loss, high inventory, cash flow shortages and tensions with their clients.

Methodology

This research is based on a four year professional doctorate project at MiddlePharma. The researchers gained access to information at all managerial levels of the firm over this period, organizing debates, focus groups and piloting scenario based simulations. At the later phases of the project the researchers gained support for the actual implementation of their propositions. The methodologies used in this article to built and codify the framework from the case study of the firm are abductive research and system dynamics. Abduction describes one form of reasoning and plays a part in qualitative data analysis – specifically, in the identification of themes, codes, and categories. There are several studies in abductive reasoning (Fernando et al. 2013; Gold et. al. 2010) presenting different ideas of what abductive reasoning consists of. We

¹ For anonymity purposes we nicknamed the firm as MiddlePharma

are embracing the approach to abductive reasoning from an epistemic and dynamic perspective, according to which abduction, is classified as common-sense reasoning rather than mathematical reasoning (Fernando et al. 2013). All in all, abductive reasoning can be seen as a process that involves four phases: (1) recognizing the existence of an abductive problem; (2) identifying candidates for solutions; (3) selecting 'the best' solutions; and (4) assimilating those chosen (Fernando et al. 2013). In the literature, an abductive problem is typically presented as the result of a 'surprising observation (whenever the agent does not know/believe it)' (Nepomuceno-Fernández et al. 2013). In our research the stakeholders observed the operations of MiddlePharma and identified possible solutions. The original proposition from the team, which was based on implementing a small-batch production planning, faced resistance from the main management team. Especially the operation managers dismissed such approach as wasteful (e.g. because of increase of changeover, set-up and cleaning times for the production stations). This rejection was based on their experience running the production line and had no related measurement to justify it further. They, instead, were proposing, for some time before this project, to invest in capacity increase, acquiring further production machines. The executive team however was skeptical about such an investment.

Experimental verification might be complex, time consuming and costly, simulation of scenarios, therefore, is needed in order to select the best solution and then assimilation of those chosen in a sense of Systemic Decision Making Process (Maani and Maharaj 2004; Mingers and White 2010). Taking into consideration the increase of problems' complexity and the fact that these were addressed within Operations Research and Management Science projects, decision making goals become increasingly imprecise (Stewart 1992). On the other hand, models that are applied to organizations require generating frameworks that allow for different levels of organization hierarchy to be analyzed (Haque et al. 2003). Many studies support that Soft Systems Thinking (SST) methodologies is an answer to the increasing complexity of the business environments and that it is superior to other approaches in dealing with complexity (Snyder 2013; Sondoss et.al. 2015). SST-based approaches are more promising in complex situations giving the managers the opportunity to describe the problem in its full systemic context (Yurtseven and Buchanan 2016). Moreover, according to Maani and Maharaj (2004) understanding systemic structures that underline organizational dynamics is a crucial prerequisite for the development of robust strategies. Furthermore, they support the notion of the 'heuristic competence' decision making as highly analogous with the notions of systems thinking, as introduced by. In a heuristic decision making process, individuals tend to revise and adjust past behaviors in response to social and psychological interactions within a complicated decision environment. Heuristic decisions made in such an environment are quick and adjustable and not necessarily considered "irrational." But they may be considered unpredictable without a coordinated measurement of either the personal or the cognitive factors that may influence the longitudinal procedure the decision maker has gone through (Phipps 1988).

Furthermore, all organizations are socio-technical systems and are characterized by their complex nature (Skyttner 2006; 2001), which justifies the SST methodological approach as an appropriate method for modeling the decision making process and understanding the interrelations of different stages and actors. System Dynamics (SD) is one approach of codifying soft system models. SD originated in the early 1960s and was pioneered by J.W. Forrester (1961, 1980). Under this approach, organizations are analyzed and viewed most effectively in terms of their common underlying flows, instead of in terms of separate functions (Samara et al. 2012). The behaviour (or time history) of an organization is principally caused by the organization's structure. The dynamic complexity arises because these structures are dynamic,

tightly coupled, governed by feedback, nonlinear, history-dependent, self-organizing, adaptive, counter-intuitive, policy-resistant, and characterized by trade-offs (Sterman 2000). The entire SD process is divided into two phases: the first phase is the qualitative analysis of the system and the second phase is the quantitative analysis of the system (Coyle 1996). During the first phase a causal-loop diagram is designed, which is then converted to a stock and flow diagram. During the second phase the stock and flow diagram is translated into a simulation program, which is then verified and confirmed. The program is implemented for alternative scenarios and the results are analyzed.

In this paper we analyze the first phase according to which we result to the policy planning for the change process. Literature review reveals other studies using the SD approach and discussing the first stage of the system formulation (Galanakis 2006; Maldonado and Grobbelaar 2017). More specifically, the first phase begins with the identification of the system's purpose. The purpose of the system leads to the identification of the system's elements, their relations (in the form of causal loop diagrams) as well as to its limitations. The qualitative analysis ends with the causal-loop diagram formulation. This demonstrates a information-action-consequences paradigm. These consequences generate further information and actions which may, in turn, continue the process (Galanakis 2006). The dynamic behaviour of this loop is the base of any analysis and the understanding of the overall implications of actions among the related stakeholders (Senge 1990). Mental scenarios are possible to be described and implemented at this stage without the need for engaging to the simulation stage.

Soft system methodologies cover a wide range of approaches that hard methodologies cannot capture and allow the decision maker to handle a complex situation in its full system context. The framework presented in the study, codified with the use of system dynamics, will help managers and executives to have a path for the stages needed to succeed a balance based decision making process. In this way, they will encounter the resistance of the organization and proceed to reforming of the heuristic-only-based thinking, via the systematic use of Key Performance Indicators (KPIs) generating evidences and exchange and evolvement of experiences.

Change Process

The transformation of a heuristics to a mixed evidence-based and heuristic decision making model requires the implementation of a change process to the organization, as an aspect of corporate management. The concept of organizational sustainability is primarily defined as the organization's ability to change (Kilintzis et al. 2019), indicating that change is a requisite for any dynamic manufacturing organization (Dooley and O'Sullivan 1999). Literature provides several change process models, often focused on different organizational elements, such as employee reaction, practical execution of specific organization itself (Stragalas 2010; Judge and Elenkov 2005). Among others, Bridges (2003), Schein (2004) and Kotter (2007) have applied their proposed models at corporate level. The first two are considered as process models, mostly discussed at an individual or group level, whilst the third one is better assorted as a change implementation model (Stragalas 2010).

Strategic change is an emergent process (Balogun and Johnson 2005) that according to Bridges (2003), takes places at an individual level through distinct stages. An individual begins the change process by sensing a specific negative feeling of discomfort, then passes through a

time of psychological re-patterning and concludes the change process with a feeling of new purpose to make the change feasible and applicable. Schein's model is also applied through specific stages, considering change as a process that starts with the 'Unfreezing Stage' where the individual considers that he/she has to act in order to achieve change, then moves to the 'Cognitive Restructuring Stage' and concludes the change process through the 'Refreezing Stage' (Schein 2004). Organizational change is a multi-level dynamic process (Dawson 1994) that comprises collective effort of multiple actors. Managers are urged to consider and apply change mainly due to poor organizational performance (Amason and Mooney 2008), while a valid framework on how to apply organizational change efficiently is lacking (Heckmann et al. 2016). From the managers' and stakeholders' point of view, resistance may be expected if attempted changes modify organizational values. Kotter (2007) considers the change process as a procedure that starts with establishing a feeling of urgency, then forming an effective guiding coalition, creating a vision for the participants, empowering the participants to share, co-own and act on that specific vision, designing and targeting short-term gains, consolidating possible improvements and creating more change and finally institutionalizing the new approaches to change. Unlike the previous models, Kotter's model of change process separately defines the changes that may take place on individual (employees), organizational and managerial (leadership) level. Thus, it may be more feasibly applied to modern organizations, as an anchor used for designing a change model fitting to their exact needs.

Taking into consideration the above mentioned models of change process and by using abductive reasoning in MiddlePharma, the authors propose a conceptual framework that captures the stages of the change process (Figure 1). The stages perform a dynamic feedback cycle composed of four subsystems:

- 1. Communicate initiative and challenge initial heuristics subsystem (S1), that challenge current practices and be legitimized by a level of authority;
- 2. Extend practice at tactical & operational level subsystem (S2), steering a constructive dialogue among different divisions, levels of hierarchy and stakeholders, in order to harmonize perceptions and to build common experiences;
- 3. Expanded implementation at operational level subsystem (S3), through phased implementation that generates early winners to be shared across the divisions and hierarchical level; and,
- 4. Empowering the implementation of the decision making process (S4), transferring the feeling of ownership across the firm (division and hierarchical lines) and empowering participation at all levels.

This conceptual framework illustrates the changed process proposition for a coupled approach between Heuristics and Evidence Decision (HeED) Making. The initiation of the HeED is that the executive team sets the aim of transition and a firm support, generating the spark of change (inner cycle). The core of the framework is based on two elements: a systemic evidence generation process, which forms new experiences for the various actors of the process; and the diversion of internal discussion from "experts" opinion to controlling and monitoring a set of measurable Key Performance Indicators (KPIs). The new experiences lead to reform the heuristic-based thinking and perceptions. For example, for the description of current practices, it is necessary to collect data related to issues raised from across the firm's departments, to prompt and challenge the initial perceptions across the firm and expose the differences on reasoning behind the current decision making. The effort then is to harmonize these initial perceptions with evidence-based understanding and exchange of experiences. This challenge though might

be the main factor that raises resistance in the different organizational levels. The rerouting of the discussion on how to control and monitor the KPIs, defuse the arguments to a practical level. This finally, leads to agree on a phased implementation plan dealing with the KPIs and sets in place a systemic monitoring approach and continuous recalibration of actions based on measurable evidences, feeding to the next stage (external loop). This then will re-feed executives and mid-level stakeholders with new evidences, maintaining authority support, thus continuing the above process across the firm, forming a closed loop.

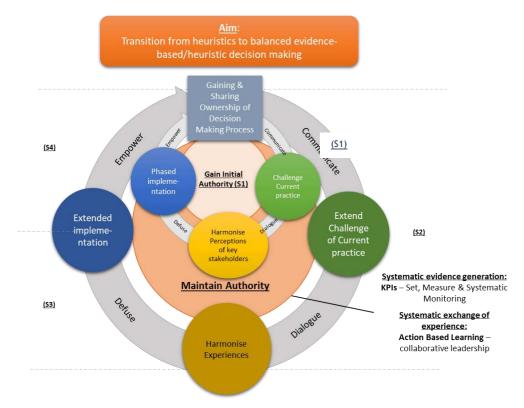


Fig. 1 The generic HeED model.

The following sub-sections introduce the details that constitute the HeED framework at each phase, how these are 'threatened' by resistance and how they will be 'protected' by countermeasures. In parallel, we codify the relations of these details into logical representations using a systems thinking approach, and we demonstrate how this thinking is applied to the case study of MiddlePharma.

Subsystem 1: Communicate initiative and challenge initial heuristics

For MiddlePharma, the initial challenge (*Challenge Initiation*) deals with the issues that the company faces in its supply chain, manifesting them in the form of sales loss, high inventory, cash flow shortages and tensions with their clients. In particular, MiddlePharma has a portfolio of more than 34 product families. Although the firm presents a 34% inventory to revenue ratio –

the average on the sector is 15% – it managed to fulfill 4 products orders at the requested quantities and another 16 partially, ranging from 77% down to 1% of the required quantities, in 2016. This challenge raised the interest from the executive management (Gain Authority Support) requesting propositions from all management levels, such as operations, marketing, logistics and supervisors on the shop-floor. The initial reaction was that there was a lack of raw material supplies due to shortages of capital and lack of capacity, particularly on the blistering and coating stations, to produce all required quantities suggesting capital investment on another production line. This opinion though did not explain the high inventory rate which is more than twice the sector's average (Challenge Heuristics & Symptomatic Solutions). Triggered from that observation and supported by knowledge from models across the supply chain management literature, the researchers prepared a challenging proposition - that the root of the issue lies at the planning and control of the production schedule, which currently is based on a balk 'campaign strategy'², and could be replaced by a small-batch production mode. The common reaction from the operation management was that the current system has been used for several years. This practice they insist, is based on their understanding (operation managers and the line supervisors) that the current practice reduces the need for change and the time for machine cleaning (Resistance). Based on this proposition we requested access to build initial evidences through a pilot project (Investigate Issues).

At executive level, there was an urgency to focus the investigation on key performance indicators (KPIs), such as the issue of cash flow availability and demand satisfaction. Based on these, we designed an extended investigation project in order to generate evidences to support or oppose the original hypothesis. The project included the simulation of a linear programming model for demonstrating the effect on cash flow, profitability, inventory and demand satisfaction based on three different scenarios: Scenario 1. level-based production, aiming to minimize purchasing costs and targeting overall annual demand quantities; Scenario 2. demand-chase strategy, aiming to maximize profits and targeting satisfying quarter demand delivery targets; and Scenario 0. current practice that generated the base of comparison. The initialization based on a proposed product mix that was used in 2016 for planning, which was believed to maximize profitability, based on annual demand and machine capacity. All scenarios use a safety stock constrain, as it has been set by current practice to 30%. This high level of safety stock demonstrates another element of the inefficiency of the current practice.

This simulation gave us the opportunity to investigate in detail a representative family of products and simulate alternative production modes. The analysis of the data from interviewing managers and operators revealed two elements. First, the production planning was based on a 'campaign strategy' design, which originates on the belief by operation management and operators that in this mode they utilize the use of the machines, reducing change over time which enables them to bargain on supplies of raw material due to economies of scale and to smooth their process. This perception though, does not reflect the understanding at executive level, which does not consider that the firm has a campaign type production design, or has seen any evidences to support this choice. Second, the prioritization of production and product mix decision was made in a meeting between the operation director and purchase and production managers, who based their choice on their experience according to which product has the highest profit margin and on which supplies are available. However, this production schedule does not reflect requirements from sales and marketing (e.g. monthly demand patterns and product-combination of orders). Furthermore, based on past experiences with unfulfilled

² In this case we define 'campaign strategy' as balk production of a single product family that does not require tool changeovers and cleaning, based on annual demand.

sales, the marketing department was requesting for a 30% safety stock in order to be able to serve their clients, which in addition was straining inventory levels.

An initial analysis derived from our research and the simulation of the different production modes (level-based production and demand-chase strategy) of the representative product family. The cash flow issues, loss of sales and high inventory, might be based on the chosen production mode and the lack of communication between operations and marketing. The suggestion on moving to a different small-batch production dismissed as costly luxury from operations managers and operators. These evidences though refocused the discussion at executive and mid level stakeholders for the need of integration across the different departments for production planning and reconfirmed that unveiling the reasons behind the issues that the firm was facing, required further systematic investigation to produce evidences (*Maintain/Reconfirm Authority Support*).

Modeling approach:

The initiation of the change process (Figure 2), or in simple words, setting the actual 'reason' that change in the initial heuristic perceptions should take place for, is the starting point of most models. Thus, Bridges (2003) describes the 'New Beginning' stage as essential for setting the new challenge to the organization, while Kotter's stages (2007) discuss the need for challenged-related vision creation, vision communication and vision empowering as critical for adopting and implementing change. Furthermore, the main goals for both heuristic and evidence-based decision making models include challenge initiation as a primary mean to adopt change. Gaining and reaffirming authority support is a crucial element in the change initiation stage. Managers at strategic, tactical or operational level may have different levels of inclusion of the change need or the change process. From the stage of Challenge Initiation, authority needs to be informed, consulted and to participate in the change implementation.

Organization's Authority Support, including both management and stakeholders (e.g. internal stakeholders such as division managers or employees and external such as suppliers), is demonstrated by the engagement in a dialogue to provide information and debate, including the actual reasons for the change need and the change objectives. Furthermore, they participate in the initial process of anticipating potential complications and determine how these may be overcome (Ionescu et al. 2014). Managers and supervisors are considered the most suitable organizational members to initially identify pilot indicative scenarios of the change process that will lead to built initial evidences. Schilling and Steensma (2001) argue that at this phase, change processes are directed by multiple strategic considerations that need to adopt more integrated ways of operating. This is necessary in order to identify propositions that tackle symptomatic solutions and not the core problem. The core considerations typically result in structured change processes based on the assumption that change process consists of a variety of interventions, which may be regarded as measurable, linearly manageable, and, objective initial evidences³ for both decision making forms (Rugman and Hodgetts 2001). Generally, the usage of specific information that have been used in order to turn troubled companies around or to create long-term successes may be the most suitable type of evidence in evidence-based decision making (Pfeffer & Sutton in press). These initial evidences need to be harmonized

³Evidence is defined in our work as an organized body of information that is used in order to justify or support conclusions (Sackett et al. 2000). This information may have many forms, depending on the type of activities that are going to be used for and the scientific or managerial context they refer to. For example Sackett et al. (2000) consider information, as forms of evidence that may be used for evidence-based decision making.

with initial heuristic perceptions. As a result, *Resistance* to this change is created, which is amplified when the change process is regarded as a more complicated procedure and requires considerable adaptation, such as **integrated** ways of operation or structural changes.

In order to move on, it has been suggested that executives and mid-level managers should let their old work patterns go and *Investigate new Issues*, taking into consideration external knowledge and the Use of Strategic, Tactical and Operational Issues as trigger opportunity⁴ (Oreg 2003). Therefore, they can draw parallel experiences and can identify strategic KPIs that may be used to Maintain/Reconfirm Authority Support in order to implement the suggested structural framework. According to Marsee (2002), organizational changes are experienced by lower organizational members through the agencies of their superiors, making authority an important factor in change initiation. While trust may be empowered by the general organizational performance and vice versa (Chakravarthy and Cho 2004), trust in authority specifically is the primary factor that may help gain the employees' confidence, including reliability, integrity and credibility in investigating issues, that will in turn result in identifying initial heuristic perceptions (Li 2005). Organization's authority may shape employee's understanding and attitude towards the change initiative, accordingly enhancing or reducing resistance to change (Jones et al. 2008). Moreover, managers and supervisors are considered the most suitable organizational members to initially identify when resistance is taking place, and the actual reasons behind resistance occurrence (Ionescu et al. 2014). The exploration of the external knowledge base allows the company to identify similarities or differences between the ways that the two perceptions will deal with the challenge/situation. This process leads to the evolution of the initial heuristic perceptions and focus the discussion at executive strategy level on designing and communicating strategic Key Performance Indicators.

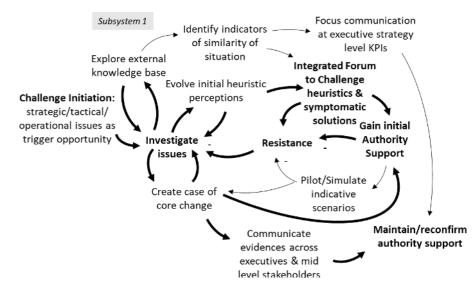


Fig. 2 Communicate initiative and challenge initial heuristics subsystem

⁴Often the reasoning for change are external to the firm factors, for example the activities and innovations of the competitor organizations, developments in technology and organizational procedures, diversity in customers' requirements, changes in national and international legislation, diversity in local and global trading and economic circumstances and changing cultural and social conditions (Radovic-Markovic 2007).

Subsystem 2: Extend dialogue evidence building

After maintaining authority support (Maintain/reconfirm authority support) for further investigation as a next step, the firm focused the discussion at the KPIs and tested the evidence from the simulation which was revealing a very different picture from the initial perspectives of managers and operators. All scenarios demonstrated a totally different product mix than the chosen one from the managers and operators. Scenario 2 demonstrated that it is possible to produce 30 product families with the current capacity, fully covering and on time demand requirements, compared to the partial production of 17 product families with the current practice. This combination potentially could improve financial performance dramatically, from \$8.900.000 gross margin of the current practice to a potential of \$18.500.000. This change comes with a small increase on setup costs from around \$120.000 currently to \$200.000. The inventory mix increases on value by 25% to around \$2.000.000 quarterly, but holding cost will be reduced by almost 40% demonstrating the much higher turnover of the inventory. These results were discussed at mid management level and with operators, taking most by surprise. At that point, the discussion directed to an effort to make operation managers and operators to agree on a measurement system which is based on the unutilized firm's ERP system that is able to cover the tactical and operational level and provide visibility across the different levels (Extend KPIs to tactical & operational level). The operators expressed their resistance to the simulation results, dismissing the simulations as theoretical models and not an actual situation, which could take the restrictions of the day-to-day operations (Resistance). Furthermore the operators expressed the fear that the ERP system might reduce their freedom to operate and control the overall process. They diverted the discussion to their understanding that the stations (coating and blistering) are operating to their limit and there is a need for further capacity investment.

As a result we suggested to investigating further the utilization level of the different production stages, engaging managers and operators to reconstruct measures from production based on the current practice for 2016. The data that was provided by the managers fed further our simulation model. This exercise had the nature of an action-based training activity that let managers and operators to lead the experimentation and debate with settings and results, leading to a common understanding (*Build evidence based experiences*). We identified that the capacity issues are actually appearing on the packaging section in any of the three scenarios (from 75% utilization level on the current situation up to 93% for scenario 2), rather than on the original thought blistering (53% utilization level currently, up to 68% for scenario 2) and coating (from 71% utilization level down to 62% for scenario 2).

Modeling approach:

The debate of the initial evidences feeds the second subsystem (Figure 3) by **maintaining and reconfirming the authority interest** about the transition from heuristics to evidence based thinking. Building-up evidence, may lead to new policies or improve adequacy of existing organizational procedures, supporting information gathering and data analysis for research and managerial purposes, contributing to medium and long term organization's development (LeRoux and Wright 2010). Maintaining executive support during the period of collecting further evidence is critical for this stage. Furthermore, repositioning the vision of the firm, sharing it at management level and setting strategic objectives that interpret this vision into practice, may occupy this period and partly defuse the raised resistance. These strategic objectives on the other hand are transformed into systemic processes and define KPIs to monitor the progress of

achieving them (Rousseau 2012). This process though requires time. KPIs relate across organizational departments to empower the whole decision context and generate transparency across the different divisions. Furthermore, KPIs provide a framework that may ensure the achievement of organizational policy goals by demarcating principles into research data, translating them into practices and monitoring the implementation of strategies. Bala and Koxhaj (2017) argue that the whole organizational performance is improved when KPIs focus on continuous challenge and improve future organizational performance. Furthermore, LeRoux and Wright (2010) consider that implementing a KPIs framework requires *to Extend to Tactical and Operational level*, as well as engage mid level management and operators.

In addition, KPIs will be used to measure and monitor the organization's dependence on output and performance indicators in comparison to both industry standards and customer/employee satisfaction. This implementation will result in Resistance, to both tactical and operational level, which is considered any behavior or attitude of pointing out willingness to promote or make a desired change regarding the organization (Schermerhorn et al. 2005). Despite the fact that change is applied in order to create positive effects for the organization, such as adapting to harsh external environment or surviving competition, organizational members often resist change and consider change attempts negatively (Boohene and Williams 2012). The KPIs framework and the generated evidence though need to be used to harmonize perceptions and Build Evidence-Based Experiences across the different management divisions, potentially defuse the initiated resistance. Action based learning has been proposed in studies in order to develop a training framework that is meant to introduce change in the organization (Vlaev and Dolan 2015). Organizational members are required to be educated about the actual meaning, need and purpose of change before applying it into the organization and the reasoning behind change (Kotter and Schlesinger 1979). Furthermore, the training framework may include critical KPIs in the form of generated evidence, such as development of employee competences and amelioration of their performance (Armstrong 2001), or the core meanings and influence of organizational culture (Ooi and Arumugam 2006). These activities engage mid-management level into the decision making and at the same time, synchronize heuristics with evidence-based decision rational.

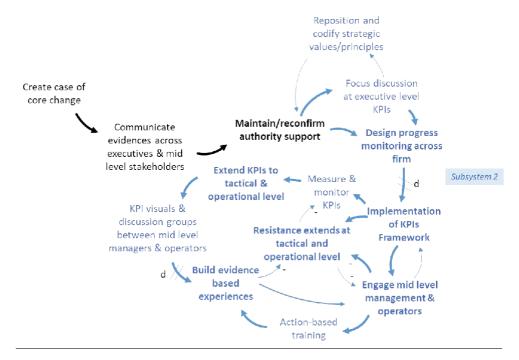


Fig. 3 Extend dialogue and evidence building subsystem.

Subsystem 3: Initiation of wide accepted milestones of change

Based on the experiences gained by the pilot project at MiddlePharma (*Build evidence based experiences*), the researchers gained support from the executive management team to initiate three focus groups. The participants were from the following groups of people in the firm: executive management team; top-management, including operations, finance and marketing managers; tactical, including mid managers and supervisors. The aims of the focus groups were to connect the different divisions and hierarchies and to bring different opinions across the organization into an open dialogue that can generate common understandings. It was generated that the focus groups will be facilitating communication and debate of the generated evidence and set common milestones for a phased implementation of changes to provide initial winners (*Set milestones of change*).

The groups in their first meetings had different approaches to the problem. Therefore a unification of the perceptions between their opinions was necessary in order to avoid conflicts (*Resistance*). Communicating the simulation results, the three groups demonstrated their different perceptions between operations and marketing divisions as well as among the different hierarchical levels. Debating the results and their priorities verified the need to have both sides on the production planning, the operational and the market. A commonly approved production schedule then was agreed. The challenge then was to be respected by operators. Transferring this concern on their level they agreed to set a standardised level of status for intervention on the scheduling plan, Open-Full-Firm-Frozen status⁵, as they referred to situations that the mid-

⁵**Frozen** referred to the timeframe to two weeks closer the actual production. Changes are prohibited at this stage because it would be costly to reverse the plan to purchase the materials and produce different products. **Firm**, two week before frozen. In these weeks changes can occur, but only in exceptional

managers were changing targets too close to the actual production point. That situation increased the stress on the line and reduced their trust in the management.

Moving towards, a small-batch production required to reduce the set-up and cleaning time. The operations director initiated a time-motion study to reduce this from a current 15%-23% of overall production time, to below 10%. This will reduce the concerns from operation managers and operators and will actually put them on the forefront of change, gaining *ownership* of change and reducing potential resistance (*Phased implementation at operational level*).

Discussing the utilization of the different stations, the initial sentiment to the participants of the focus groups was that the bottleneck was due to the lack of automation of the packaging station. MiddlePharma has a corporate responsibility agreement with the local community to employee women from the local community in flexible contracts, in order to balance family and work. This creates issues of systematization as these employees show a very high level of turnover. However, there is no active training or support to improve their skills and systematize their work. Triggered by this debate and the investigation of low-tech automation on the station and use of evidence on output changes, after training as operators in order to improve productivity and be able to move to different functions across the organization, the focus groups agreed that investing on training instead of automation was a more cost-effective and time-effective approach.

The product mix on the other hand required a mix based on the actual demand context. Top management and marketing directors expressed the need to plan together 'blockbuster' products and low profit-margin products. Agents in the different regions required combined offers and not individual product family ones. Especially on public procurement cases and for *generic* pharmaceutical products, where the decision is based on cost, the marketing director stressed the need to target combined product families as the agents refuse to pay for part of the required mix, or order otherwise. Therefore, the design of a production plan that maximizes the available variety of product families is essential. As a result of this discussion, the directors agreed to set a common framework of monitoring and prioritizing products. A set of KPIs that highlighted priorities among the operations (e.g. profit margin maximization, cash flow control) and marketing (e.g. order fulfillment, time to market) divisions and reflect a shared performance target level (*KPIs Framework*) was thus proposed to be included in the ERP monitoring mechanism to provide a view from both sides.

Finally, a training of key stakeholders from different levels was decided for them to play the role of champions of change. Our suggestion, taking into consideration the need of MiddlePharma, was to receive training from sources external to the firm and based on a wellestablished framework. One of the training frameworks that has been suggested for MiddlePharma was Lean Management. Such approach demonstrates practically how the company can utilize planning of small batches, low inventory controls and implement actions for generating a shared culture across different divisions. This suggestion was discussed at the executive level and approved as a next step of implementation.

Modeling approach:

situations. **Full**, which means that all the available production capacity has been allocated to orders. Changes in the full section can be made and production costs will be only slightly affected, but the effect on customer satisfaction is uncertain. The last section called **Open**, which means that there is available capacity for new orders (based on <u>Gaither and Frazier 2002</u>).

The new evidence based experiences that have been generated at the subsystem 2 over time, feed subsystem S3 (Figure 4). These experiences, after being acquired, trigger discussion between the marketing, finance and operations departments, with often competing interests, creating further **resistance**. These divisions might be eased by exposing them to evidence from the general market and competitors, evaluating such a way on how to adapt to such an environment (Gibbons 2013). Fiegenbaum and Thomas (1995) suggest that these comparisons should be further extended away from the industry competitors, creating wider awareness and expanding learning to the conditions that the external stakeholders are operating. On the other hand, they need to focus discussion around KPIs in all three levels, namely strategic, tactical and operational in order to take the right decisions and Set Milestones of Change that are understood and shared at all levels. Achieving evidence-based milestones is facing Resistance, as there is steady refusal to accept any new goal that is not expected or explained (Rumelt 2011). Inspiring ownership at operational level is also facing similar resistance and leads to a need for Phased Implementation at Operational Level (Rumelt 2011). The phased implementation tests for the first time the combined process experiences, thus leading to the measuring and monitoring of KPIs, but also provides a level of ownership. This process will need time and will result in achieving a KPIs Framework that covers the concerns of the different divisions and hierarchical levels.

This framework aims to defuse resistance in the new evidence based experiences. The inspiration of the ownership is positively influenced by the champions of change (Bartkus 1997). A change champion can make a key impact on the outcomes of a change management program (Balsvik and Haller 2015), but it is not enough to just nominate change champions and then expect them to get on with it. In order to play a meaningful role well, change champions need to be managed, developed and trained, and as a team be able to gain feedback on employees for day-to-day work and KPI measures, and given the opportunity to resolve issues through an action learning approach at low (operational) level, transferring ownership to that level (Talebi 2015).



Fig. 4 Expanded implementation at operational level

Subsystem 4: Empowering implementation of Systemic Decision Making Process

By setting the common KPIs framework for MiddlePharma the full implementation of the acquired, but underused, ERP system across the firm agreed to be used as a central element for engaging each one of the employees to a transparent performance measurement system. The implementation of this system needs to be explained to all employees in order to reduce the feeling of losing their degree of freedom and flexibility in their work decisions (*Resistance*). The ERP will be the common platform for aligning operations, finance and marketing, monitor KPIs and inform the tactical and strategic levels of management (*Inform strategic & tactical level*).

Furthermore, 'what-if' scenarios agreed to become a quarterly action-based learning exercise providing triggers for change and fostering common experiences across the different divisions. The first of these scenarios to be tested is the reduction of safety inventory levels to a lower level, with a target of lowering below 10%.

A visual warning system at operational level agreed to be implemented in the next quarter based on the common KPIs (*Measure & monitor KPIs*). Finally a twice per week decision making and debriefing meeting set as regular, connecting operational, and marketing directors with the supervisors from the divisions, partly as implementation of a continuously improvement method. This would then be cascaded and monitored continuously at operational level with the new visual warning system.

Modeling approach:

S4 is the final subsystem of a systemic implementation across the firm and monitoring approach that will re-feed executives and mid-level managers with new measurable evidences, continuing the whole process. At this subsystem (Figure 5) the objective is to share ownership of the decision making system into the operational level and across employees and continuously renew the experiences across the firm's division and hierarchical levels, reinforcing a common culture and understanding. This framework generates *aligned strategic, tactical and operational level KPIs*, recognizing that organizational change is a multi-level dynamic process (Dawson, 1994) that comprises collective effort of multiple actors. According to Trader-Leigh (2001), there is a need to *Inform and Align Strategic, Tactical and Operational levels*, which must become aware and understand how potential what-if scenarios affect the operational system that has been established and accepted over time and comprehend the cost and dynamics of attempted change.

Furthermore, the proposed KPIs Framework is processed along a notion of Continuous Improvement (CI) that creates a continuous feedback stream from all the employees. CI is generally considered as a procedure aiming to optimize information, physical flows and products in order to handle quality levels and production costs (Caroly et al. 2010). However Garcia-Sabater and Marin-Garcia (2011) directly connected CI to change implementation, as they consider it a planned process organized and systematized as a part of an incremental and continual change.

Resistance to change is a major element, considering organization's CI. It may occur at all stages of the change process but it mostly takes place at the final ones, mainly due to lack of employee involvement in the process itself, inadequate legitimacy among top management or loss of trust (Huy et al. 2014). Therefore, managers are required to plan specific practices that

are aimed at managing resistance from the beginning (Eriksson 2004). Managers may help restoring employee commitment and increase employee motivation by applying individual initiative, promoting employee involvement in evidence generation and **owing the monitoring and re-enforcement** of the performance measurement procedures (Dholakia and Sonenshein 2012). Furthermore, Sverdrup and Stensaker (2017) introduced a 3-stage model of conceptualizing trust repair that consists of three major levels: (a) Restore mutuality between management and employees; (b) renegotiate the transactional rules of the psychological contract; and, (c) extend the psychological contract in order to comprise relational terms. According to Svensson (2004), lack of legitimacy may be overcome by applying mechanisms, such as intelligent management design, normative integration between external and internal organizational elements, proper procedures regarding debatable practices, and prevention of conflicting information.

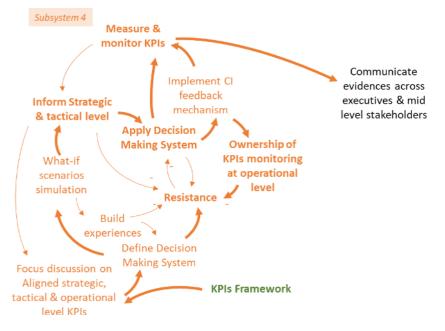


Fig. 5 Empowering implementation of Systemic Decision Making Process Subsystem

Discussion and Conclusions

The decision-making activity is considered as a management action under the control of the organization, and it is complex and challenging (Elbanna and Child 2007), while little attention has been given to the connection of the various decision making methodologies with the real life outcomes (Bavol'ár and Orosová 2015). Our study demonstrates that actual decision-making activities in a firm do not always have a clear logic or follow an evidenced-based process. Furthermore, it cannot be assumed that the different internal stakeholders (managers from different divisions and hierarchical levels) have the same understanding, experiences or priorities as supported by (Venkata 2007). In fact, the decision making process in our case proved to be differentiated at different stages of management, with the executive top level to be prone to making decisions using strategic approaches with mixed EBDM and HDM characteristics. This "mixed" decision making model may be considered similar to the Multi-Criteria Decision Making (MCDM) approach, pointing that every aspect along the decision making chain must be considered individually (Danesh et al. 2018). According to Bray (2015)

the MCDM framework can be primarily used by organization's stakeholders and top level management. On the contrary, the managerial middle level showed a tendency to making quick 'ad-hoc' decisions, using an HDM approach while bottom production level showed a constant resistance to change, showing a mostly EBDM decision making approach, depending on past similar orders and cognitive experiences emerging from the organizational environment. As a result, we support the arguments from Venkata (2007) that in order to let a firm achieve effective decision-making, all the functions in the firm and factors that affect the entire manufacturing environment must be examined.

Our model demonstrates that the two distinctive decision-making systems, based on heuristics or evidence based approaches, are not possible to be distinctive, but are interrelated. In particular, the HeED framework demonstrates that one feeds the other continuously. Firms are required to combine the speed of heuristic models with in-depth study of the elements of the evidence-based models. In fact, the framework proposes the creation of new shared experiences base on a systemic evidence-building process. However, this requires extensive change of practices, norms and day-to-day activities across the firm. Through the detailed system dynamics framework (Figure 6) we demonstrate the stages of building this change and prepare managers and executives for the resistance that will be evident throughout the organization during the transition.

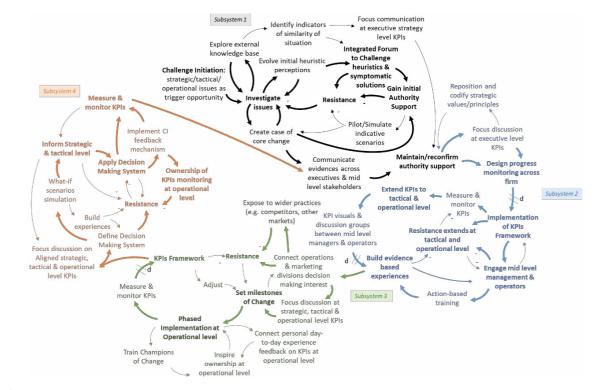


Fig. 6 The overall HeEd systemic logic

The development of the HeED framework requires an initiation of the challenge that derives from the top. This initial hierarchical approach to change, gives space overtime to a bottom-up process, by implementing tools such as continuous improvement and action-based learning. This leads to a change in the company's culture, from top-down, to a bottom-up direction, where all employees are deemed necessary for empowering the implementation of a systemic decision making process. This change takes time, is not automatic and needs to be nurtured by the management team. Practices that harmonize perceptions among the divisions and hierarchical levels of the company, by participating in discussion groups and action-based training, leads to building common experiences and sharing cultural norms. Systematizing these actions is necessary to reinforcing the process, otherwise it will be easily disrupted and return to a static norm.

This study is implemented using abductive reasoning in order to make logical inferences and construct the framework's theory based on a case study company, and using system dynamics proceeding to a modeling approach of this framework. System dynamics is a scientific area that deals with the creation of models that describe with satisfactory approach the operation of real systems, enabling them to study their dynamic behavior. The need for this approach is derived by the level of initial resistance that does not allow any different proposition to be applied, even in pilot form. The system dynamic modeling used to communicate the initial ideas that challenged the status-quo in the firm. They are used to project on how the researchers' propositions could change the performance of the firm, without actually having to invest in any of the proposed changes. This is proven crucial as defusing the initial resistance and keeping support from the executive management team is the essential element to bring the cycle into the phase 2 (subsystem 2). In our case, phase 1 took the longest to be completed, although it had the least cost-related investment, demonstrating the strength of the initial inertia in any firm to change.

Another element that made a difference in this initial phase was the acceptance of the executive team to have an agent with an independent voice inside the company. This agent is essential to generating ideas for solutions adapted from different sectors and has the freedom to challenge different opinions demonstrating experiences from across the competitive environment of the firm. This however, needs to be a temporary structure in the firm. The HeEd framework provides the steps to build permanent structures that communicate openly information across the organization, have the freedom to debate further changes and empowers a continuous loop of improvements. Similarly, at the later phases the champions of change are necessary initially, but are the ones to transfer the decision drive to the collective structures that are proposed by the framework, for example, by organizing the common monitoring process and facilitating the action-based learning session. In the case that this transition does not succeed, it might mean that the resistance from the different levels in the firm will resume, as trust will be eroded over time, endangering the overall process.

Concluding the HeED framework demonstrates that the two decision making systems are inseparable and that the process of changing to a balanced decision making approach is a process that requires the evolvement of norms inside the firm, opening the decision making process to all the different hierarchical levels and divisions and maintaining trust across the organization.

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