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Lean Manufacturing and Industry 4.0: a survey in Brazilian manufacturing companies

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Abstract:

Aims(s): This paper aims to examine the relationship between Lean Production (LP) practices and the implementation of Industry 4.0 in Brazilian manufacturing companies.

Methodology: To achieve that we use data from a survey carried out with 110 companies of different sizes and sectors, at different stages of LP implementation. Data collected was analyzed by means of multivariate analysis.

Results: Our findings indicate that LP practices are positively associated with Industry 4.0 technologies and their concurrent implementation leads to larger performance improvements.

Practical Implications: The contextual variables investigated do matter to this association, although not all aspects matter to the same extent and effect.

Keywords: Industry 4.0, Lean manufacturing, Manufacturing management, Lean production, Emerging economies, Empirical research.

1. Introduction

Lean Production (LP) is an approach widely deemed and spread among several industries that aims at reducing waste and improving productivity and quality according to customers' requirements (WOMACK et al., 2007; LAGE JUNIOR; FILHO, 2010; JASTI; KODALI, 2015). The implementation of LP means a systematic human-centered approach of various management principles and practices (SEPPÄLÄ; KLEMOLA, 2004). The principles

are the elements of the strategic level and they represent the ideals of the system, such as identifying value from the customer's perspective, eliminating all kinds of waste, producing according to the pull of the customer, and continuous flow production (Liker, 2004; Papadopoulou and Ozbayrak, 2005). The practices are the elements that operationalize the principles (TORTORELLA et al., 2016b). In essence, the implementation of LP comprises a low-tech approach that excels for simplicity and effectiveness usually aligned with a shared business vision.

This context, this paper aims to examine the relationship between LP practices and the implementation of Industry 4.0 within a developing economy context, such as the Brazil. As previously indicated by Landscheidt and Kans (2016), Kolberg et al. (2016), and Gjeldum et al. (2016), there is a lack of studies that empirically investigate the relationship between a successful lean implementation and the progression into Industry 4.0. The literature that correlates LP and Industry 4.0 is scarce and only suggests a positive association between these approaches, but without testing empirically. To achieve that we use data from a survey carried out with 110 companies of different sizes and sectors, at different stages of LP implementation. Respondents were asked to provide answers to four questionnaires: Q1, which described the companies' contextual variables identified in the literature as influential in the adoption of both approaches; Q2, which assessed the implementation level of 41 interrelated and internally consistent LP practices, which have been empirically validated by Shah and Ward (2007); Q3, which comprised the identification of the adoption level of 10 interrelated Industry 4.0 technologies that are more likely to be implemented in this context, as suggested by Brazilian National Confederation of Industry (2016); and Q4, which aimed at identifying the operational performance improvement within the companies in last few years.

This rest of this paper is structured as follows. Section 2 presents the theoretical background. Section 3 describes the proposed method, with results of its application presented in section 4. Section 5 closes the paper presenting conclusions and future research opportunities.

2. Literature review

2.1. Industry 4.0

The term "Industry 4.0", coined in 2011 on the Hannover Fair in Germany, describes an industry whose main characteristics comprehend connected machines, smart products and

systems, and inter-related solutions. Such aspects are put together towards the establishment of intelligent production units based on integrated computer and/or digital components that monitor and control the physical devices (LASI et al., 2014; ASHTON, 2009). In this sense, Industry 4.0 aims for an autonomous and dynamic production, which integrates Information and Communication Technologies (ICT) to enable a mass production of highly customized products.

Several governmental institutions have started to study and assess the implementation of Industry 4.0 technologies in their countries, such as Germany, United States and Canada. Specifically within the developing economies' context, such as Brazil, the National Confederation of Industry (2016) has carried out a survey to identify the existing challenges for implementing Industry 4.0 technologies. High implementation costs were pointed as the main internal barrier for advancing on Industry 4.0, while lack of skilled workers was indicated as the biggest challenge among the external factors. Overall, ten digital technologies grouped into three different application areas were identified, as shown in Table 1. Results also indicated that a feature of digitalization in Brazilian industry is the focus on processes, i.e. on increased efficiency and productivity. These findings corroborate to the study undertaken in Mexico, which is responsible for producing 80% of high tech exports of Latin America (MINISTRY OF ECONOMY, 2016). Similarly, in India, the government has presented in 2014 an initiative with the purpose of positioning the country as one of the main hubs of global manufacturing and design (FORBES INDIA, 2016). However, despite these initiatives, there is still much to understand and deepen about the benefits and challenges posed by the adoption of Industry 4.0 technologies in these contexts.

Focus	Technology			
Process	i_1 - Digital automation without sensors			
	i_2 - Digital automation with process control sensors			
	i_{3} - Remote monitoring and control of production through systems such as MES [*] and			
	SCADA ^{**}			
	i_4 - Digital automation with sensors for product and operating conditions identification,			
	flexible lines			
Developmen	i_{5} - Integrated engineering systems for product development and product manufacturing			
t/ reduction	i_{6} - Additive manufacturing, rapid prototyping or 3D printing			
in time to	i_7 - Simulations/analysis of virtual models (finite elements, computational fluid dynamics,			
market	etc) for design and commissioning			
Product/	i_8 - Collection, processing and analysis of large quantities of data (big data)			
new	i_9 - Use of cloud services associated with the product			
business	i_{10} - Incorporation of digital services into products (Internet of Things or Product Service			
models	Systems)			
* MES - Manu	afacturing Execution Systems			
** SCADA - Supervisory Control and Data Acquisition				

 Table 1 - Digital technologies surveyed within Brazilian industrial context

Source: Adapted from National Confederation of Industry (2016)

2.2. Lean production and industry 4.0

In the past few decades, scientific journals have published a number of articles that focus on describing and characterizing the content of LP; yet, there is not a precise and agreed upon way of defining or measuring LP. Although, researchers usually agree upon several overlapping practices (MARODIN; SAURIN, 2013), and their positive association with operational performance, in both developed (SHAH and Ward, 2003; DEMETER; MATYUSZ, 2011; NETLAND et al. 2015) and emerging economies countries (TAJ; MOROSAN, 2011; PANIZZOLO et al., 2012; JASTI; KODALI, 2016). Kolberg et al. (2016) affirm that LP can be considered as a complement to the technological point of view emphasized in Industry 4.0. Both LP and Industry 4.0 favor decentralized and simple structures over large and complex systems; while aim for small and easily integrated modules with lower levels of complexity (ZÜEHLKE, 2010). However, contradictory evidences found in literature (e.g. EROL et al., 2016; SCHUMACHER et al., 2016; SANDERS et al., 2016) indicate that the comprehension of such association and its impact on operational performance still needs to be deepened and better explored. Hence, although research initiatives and practical experimentations already exist, they are mostly the application of a single or isolated aspect. In this study, we examine the relationship between the simultaneous implementation of LP - represented by 41 practices (see Table 2) proposed and validated by Shah and Ward (2007) – and Industry 4.0 readiness, and their influence on the companies' operational performance.

3. Research method

There are three stages to the research method proposed here: (i) questionnaire development and data collection, (ii) clustering of data, and (iii) data analysis. These stages are detailed in the sections to follow.

3.1. Questionnaire development and data collection

The questionnaire was sent by e-mail to 465 companies. The final resulting sample comprise 110 valid responses representing a response rate of 23.65%. The sample presents a balanced amount of companies for each contextual variable. Most respondents were from large companies (67.3%); the majority of companies belonged to metal-mechanics sector (61.8%); and most companies (70.9%) started their LP implementation more than 2 years ago.

Underlying	Operational	Lean production practices
constructs	constructs	l_{n_1} - We frequently are in close contact with our suppliers
Customer related	Supplier	lp_1 We requerily use in close contact with our suppliers lp_2 . We give our suppliers feedback on quality and delivery performance
	feedback	lp_2 We strive to establish long-term relationship with our suppliers
		lp_3 We shive to establish long term relationship with our suppliers lp_4 . Suppliers are directly involved in the new product development process
	IIT delivery	lp_4 Suppliers are uncerty involved in the new product development process
Supplier	JII delivery	lp_{5} . We have a formal supplier certification program
related		lp_6^{-1} We have a formal supplier certification program
Terated		lp_{r} Our suppliers are located in close proximity to our plants
	Developing	In. We have corporate level communication on important issues with key suppliers
	suppliers	In. We take active steps to reduce the number of suppliers in each category
		<i>Ip</i> ₁₀ - we take active steps to reduce the number of suppriers in each category
		<i>Ip</i> We evaluate suppliers on the basis of total cost and not per unit price.
		lp_{12} we evaluate suppliers on the basis of total cost and not per unit price
	Involved customers	p_{13} - we nequently are in close contact with our customers
Customer		<i>Ip</i> ₁₄ . Our customers are estively involved in current and future product offeringe
		<i>p</i> ₁₅ - Our customers are actively involved in current and future product offerings
related		<i>ip</i> ₁₆ - Our customers are directly involved in current and future product offerings
		<i>lp</i> ₁₇ - Our customers frequently share current and future demand information with
		Inarketing department
		p_{18} - Production is puned by the simplicity of minimized goods
	Pull Flow	lp_{19} - Production at stations is pulled by the current demand of the next station
		lp_{20} - we use a pull production system
		lp_{21} - We use <i>kanban</i> , squares, or containers of signals for production control
		lp_{22} - Products are classified into groups with similar processing requirements
		lp_{23} - Products are classified into groups with similar routing requirements
		lp_{24} - Equipment is grouped to produce a continuous flow of families of products
		<i>lp</i> ₂₅ - Families of products determine our factory layout
	Low setup	lp_{26} - Our employees practice setups to reduce the time required
		lp_{27} - We are working to lower setup times in our plant
		lp_{28} - We have low set up times of equipment in our plant
		lp_{29} - Large number of equipment/processes on shop floor are currently under SPC
Internally	<i>c</i> ₈ - Controlled processes	lp_{30} - Extensive use of statistical techniques to reduce process variance
related		lp_{31} - Charts showing defect rates are used as tools on the shop floor
		lp_{32} - We use fishbone type diagrams to identify causes of quality problems
		lp_{33} - We conduct process capability studies before product launch
	<i>c</i> ₉ - Involved employees	lp_{34} - Shop floor employees are key to problem solving teams
		lp_{35} - Shop floor employees drive suggestion programs
		lp_{36^-} Shop floor employees lead product/process improvement efforts
		<i>lp</i> ₃₇ - Shop floor employees undergo cross functional training
	<i>c</i> ₁₀ - Productive maintenance	lp_{38} - We dedicate a portion of everyday to planned equipment maintenance related
		activities
		lp_{39} - We maintain all our equipment regularly
		lp_{40^-} We maintain excellent records of all equipment maintenance related activities
		lp_{41} - We post equipment maintenance records on shop floor for active sharing with
		employees

Table 2 - LP constructs and practices

Source: Adapted from Shah and Ward (2007)

The questionnaire was structured in four parts. The first part aimed to collect demographic information of the respondents and their companies. The second part of the questionnaire assessed the level of LP practices adoption based on Shah and Ward's (2007) assessment model, which comprises 41 questions related to ten operational constructs. Each

practice is described in a statement that was evaluated according to a Likert scale that ranged from 1 (fully disagree) to 5 (fully agree). The third part of the questionnaire aimed at measuring the degree of adoption of the Industry 4.0 technologies within the studied companies. For that, 10 questions were formulated according to different technologies as suggested by Brazilian National Confederation of Industry (2016), which are claimed as the most adopted ones by Brazilian manufacturing companies. Similarly, the degree of adoption was measured in a 5-point Likert scale ranging from 1 (not used) to 5 (fully adopted). Finally, the fourth part assessed the observed operational performance improvement during the last three years, according to five indicators: (i) productivity, (ii) delivery service level, (iii) inventory level, (iv) workplace safety (accidents) and (v) quality (scrap and rework). A 5-point scale ranging from 1 (worsened significantly) to 5 (improved significantly) is used in the questionnaire.

Further, we tested all responses related to the 41 LP practices, 10 technologies of Industry 4.0 and the 5 performance indicators for reliability, determining their Cronbach's alpha values. An alpha threshold of 0.6 or higher was used (MEYERS et al., 2006). Responses displayed high reliability, with an overall alpha value of 0.993, 0.857 and 0.834, respectively.

3.2. Clustering of data

In this step, we perform three clustering of observations using questions on (i) implementation level of LP practices, (ii) adoption level of Industry 4.0 technologies, and (iii) operational performance improvement as clustering variables. Clustering tools are used to analyze relationships within a database in search of a summarized representation of data, grouping observations in a small number of clusters (EVERITT, 1980). According to Rencher (2002), observations in a cluster should be similar to those assigned to the same cluster, and different from those assigned to other clusters. In all clusterings performed on the same sample of observations, we first applied a hierarchical method to identify the proper number (say k) of clusters – we used Ward's method for that – and then the k-means clustering method, to rearrange observations into k clusters. See Rencher (2002) for more details.

When clustering using the implementation level of LP practices as clustering variables, two clusters were identified. An ANOVA (Analysis of Variance) was performed to verify differences in means of clustering variables calculated using data from each cluster. For all 41 clustering variables, we found significant differences in means (p-values < 0.05 in all cases).

The 48 observations assigned to cluster 1 presented a high average adoption level of LP practices, and the cluster was labeled HLP (high level of lean production implementation); the 62 observations assigned to cluster 2 presented a low average adoption level of LP practices, and the cluster was labeled LLP (low level of lean production implementation).

The same observations were clustered using the adoption level of the 10 technologies of Industry 4.0 as clustering variables. The same procedure was used and found two clusters. Among the 10 clustering variables an ANOVA (Analysis of Variance) identified significant differences in means (p-values < 0.01 in all technologies). The 78 observations assigned to cluster 1 presented a low average adoption level of Industry 4.0 technologies, and the cluster was labeled LTC (low level of Industry 4.0 technologies implementation); the 32 observations assigned to cluster 2 presented a high average adoption level of Industry 4.0 technologies, and the cluster was labeled HTC (high level of Industry 4.0 technologies implementation).

Finally, a third cluster analysis was performed taking into account the operational performance improvement. Results for the five performance indicators were similarly processed, indicating the existence of two clusters, whose significant differences in means (p-values<0.01) were verified through an ANOVA. The first cluster corresponds to 42 observations whose average improvement level of operational performance was lower, being named as LPI (low level of performance improvement); the second cluster is comprised of the 68 remaining observations that presented a high average improvement level of operational performance performance, and labeled HPI (high level of performance improvement).

3.3. Data analysis

In step 3.2, three sets of clusters became available. In the first set, observations were grouped in clusters HLP and LLP according to LP implementation level; in the second set, observations were grouped in clusters HTC and LTC according to the adoption level of Industry 4.0 technologies; and the third one, with regards to the performance improvement level, grouped into HPI and LPI. We now test for differences in the means of two contextual variables (company's size and time of LP implementation in the company) across clusters in each set.

First, we tested whether the frequency of observations from the cluster of LP implementation (LLP and HLP) was associated to the adoption level of Industry 4.0 technologies (LTC and HTC) according to the level of operational performance improvement

(LPI and HPI). Second, we tested data from each contextual variable according to Industry 4.0 technologies and to LP implementation levels. We considered significant associations with adjusted residual values larger than |1.96| and |2.58|, corresponding a significance level of 0.05 and 0.01, respectively.

4. Results

Table 3 presents the contingency table and chi-square results for all combinations of levels (LLP and HLP) of LP practices implementation and Industry 4.0 technologies (LTC and HTC), according to the performance improvement level of the companies. Frequencies indicate the number of companies assigned to each cluster combination; for example, there are 16 companies appearing simultaneously in clusters LLP, LTC and LPI. Adjusted residual values indicate that, for companies that have not observed higher levels of operational performance improvement in the last three years, none of the associations between Industry 4.0 and LP are significant. Contrary to conventional expectation, despite the existence of companies that claim to be widely implementing LP practices and/or Industry 4.0 technologies within this group, none of them perceived a relevant operational performance improvement. An explanation for such outcome relies on the arguments presented by Pay (2008), Liker and Rother (2011) and Longoni et al. (2013), which highlight that any improvement approach, regardless of its methods, when misunderstand or misapplied in a company may have its benefits reduced, causing even contrary effects to the expected ones. Consequently, before deciding to implement any productivity improvement approach, management must first examine its business strategy and verify if such approach can contribute directly to the company's strategy.

 Table 3 - Chi-square test among levels of Industry 4.0 technologies and LP implementation according to operational performance improvement

Operational		LLP		HLP		
performanc e improveme nt	Industry 4.0 technologies	Frequenc y	Adjusted residual	Frequenc y	Adjuste d residual	Total frequenc y
	LTC	32	-1.01	4	1.01	36
LPI	HTC	4	1.01	2	-1.01	6
	Total frequency	36		6		42
	LTC	24	2.88^{**}	18	-2.88**	42
HPI	HTC	2	-2.88^{**}	24	2.88^{**}	26
	Total frequency	26		42		68

* significant at 5%; ** significant at 1%

Table 4 displays the results for chi-square tests among implementation levels of Industry 4.0 and LP according to companies' size. Previous researchers (e.g. SHAH; WARD, 2003; KAGERMANN et al., 2013) have argued that the implementation of both approaches may be positively influenced by the size of the company, since larger companies usually present a higher capital expenditure capability. Our results raise a different discussion, since they demonstrate that the association between Industry 4.0 and LP is significant regardless the companies' size. Indeed, they indicate that both small- and large-sized companies that are highly adopting Industry 4.0 technologies are more likely to be widely implementing LP practices. This finding suggests that, although smaller companied may face different challenges than larger ones, the concurrent adoption of Industry 4.0 and LP is feasible in both contexts and size should not be seen as an impediment for that. Further, within the studied sample, it is worth noticing that the frequencies of small and large companies that are poorly implementing LP and Industry 4.0 is higher than the other combinations. As suggested by Saurin and Ferreira (2009) and Tortorella et al. (2015), LP implementation in Brazil is still rare and focused mainly on case studies with a few selected companies. When considering the adoption of Industry 4.0 technologies in Brazilian context, this gap is even larger, according to Anderl (2014) and National Confederation of Industry Brazil (2016). Therefore, it is quite reasonable to expect such low frequency of companies adopting both approaches and our results corroborate to this assumption.

	Industry 4.0 technologies	LLP		HLP		Total
Companies' size		Frequenc y	Adjusted residual	Frequenc y	Adjuste d residual	frequenc y
	LTC	20	2.21*	6	-2.21*	26
Small and	HTC	2	-2.21*	8	2.21^{*}	10
medium	Total frequency	22		14		36
	LTC	36	2.84^{**}	16	-2.84**	52
Large	HTC	4	-2.84**	18	2.84^{**}	22
	Total frequency	40		34		74

 Table 4 - Chi-square test among levels of Industry 4.0 technologies and LP implementation according to companies' size

* significant at 5%; ** significant at 1%

Finally, regarding the contextual variable "time of LP implementation" Table 5 shows results of the contingency table with chi-square test values. For companies that have been implementing LP for less than 2 years (usually categorized as beginners), results do not indicate a significant association between Industry 4.0 and LP. Generally, the experience on

LP implementation experience is associated with a higher level of awareness, which provides a better understanding of its practices and underlying principles. Since LP is a forerunner approach and these companies are not quite experienced on it, it is reasonable that no association was found between LP and the technologies from Industry 4.0, which is an even newer approach. This fact is also observed in companies that claim to be widely implementing LP and Industry 4.0. However, as companies become more experienced on LP implementation (>2 years), results show a significant association with Industry 4.0. Analogously to the obtained results for companies' size, experienced companies that claim to be highly adopting Industry 4.0 technologies are the ones that also implement LP practices more extensively. In turn, despite their experience, it appears that the frequency of companies that still struggle in implementing LP practices is much higher when they also poorly adopt Industry 4.0 technologies. Therefore, our results converge to previous studies (Hines et al., 2004; Jasti and Kodali, 2015) and bear that company's experience on LP implementation is an important variable to be considered when associating LP practices to other improvement approaches, such as Industry 4.0.

 Table 5 - Chi-square test among levels of Industry 4.0 technologies and LP implementation according to companies' time of LP implementation (years)

	•		1	Č,		
		LLP		HLP		Total
Time of LP implementation	Industry 4.0 technologies	Frequenc y	Adjuste d residual	Frequenc y	Adjuste d residual	frequenc y
	LTC	20	1.33	4	-1.33	24
< 2	HTC	4	-1.33	4	1.33	8
≤ 2 years	Total frequency	24		8		32
	LTC	36	3.36**	18	-3.36**	54
> 2 years	HTC	2	-3.36**	22	3.36**	24
	Total frequency	38		40		78

* significant at 5%; ** significant at 1%

5. Conclusions

We provide a deeper understanding on how Industry 4.0 can support the implementation of LP practices, allowing companies undergoing lean implementation to better manage their change processes while they move towards the fourth revolution. As companies continue to focus on <u>implementing</u> LP and efficient ways of doing business, there will be an increasingly demand for incorporating novel technologies.

We presented empirical evidences on how Industry 4.0 technologies and implementation of LP practices are associated. Results showed that the frequency of both small- and large-sized companies that claim to be barely implementing LP and Industry 4.0 is higher. On the other hand, most companies that are have a higher adoption level of Industry

4.0 technologies also state a higher implementation level of LP. Such evidence indicates that size may not be a barrier for a concurrent implementation, and smaller companies may be encouraged to follow the same path. Overall, evidences presented here suggest that the studied Industry 4.0 technologies are significantly associated with the implementation level of LP practices. Analyzing those results, companies undergoing lean implementation may be able to set and adopt these technologies in order to achieve higher operational performance improvements.

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