

PROCESS ENGINEERING AND AI SALES PREDICTION: THE CASE STUDY OF AN ITALIAN SMALL TEXTILE COMPANY

Nicola Magaletti¹, Gabriele Cosoli¹,
Angelo Leogrande¹ and Alessandro Massaro^{1,2,*}

¹LUM Enterprise srl, S.S. 100 - Km.18, Parco il Baricentro, 70010, Bari, Italy.

²LUM - Libera Università Mediterranea "Giuseppe Degennaro",
S.S. 100 - Km.18, Parco il Baricentro, 70010, Bari, Italy

ABSTRACT

The paper describes the case study of a production process engineering applied to a company working in the textile sector and upgraded by digital technologies. The process engineering is performed by means the Business Process Modelling Notation (BPMN) approach. The new engineered processes are enabled by adopting a software platform able to extract data from work documents using a Robotic Process Automation (RPA) technology based on digital document features recognition. The implemented platform also integrates a Decision Support System (DSS) based on the estimation of priority rules and of Key Performance Indicators (KPIs) supporting subcontractor's management and related activities. Furthermore, the DSS integrates sales forecasting Artificial Intelligence (AI) algorithms. A comparative analysis about regression-based algorithms and Artificial Neural Network (ANN) Multilayer Perceptron (MLP), is performed to check the best algorithm performance about the product quantity prediction in function of the price, finding ANN-MLP as a good candidate for the estimation. The ANN-MLP model is optimized to provide sales forecasting results with a low Mean Absolute Error (MAE) of 0,00113. All the analysed algorithms are applied to an experimental dataset. The results have been developed within the framework of a Ministerial Italian project named Smart District 4.0 (SD 4.0).

KEYWORDS

Decision Support System, Process Engineering, Sales Prediction, Artificial Intelligence.

1. INTRODUCTION

In this section is described the general scenario of the technologies and approaches adopted in the pilot case of study. Automating repetitive tasks can produce human errors [1] that can be decreased by the adoption of the Robotic Process Automation (RPA) technology. RPA is useful to eliminate repetitive activities, to reduce the labour consumption, to assign employees to new production areas, and in general to minimize human errors [2]. Different tools can be applied for advanced data processing. Artificial Intelligence (AI) surely plays an important role in the context of business processes [3], and can be combined with RPA for data processing, especially when in the production processes are identified routinely tasks [4]-[6]. The use of AI can improve the efficiency of RPA in Industry 4.0 scenarios, by providing good application performances in data recognition, classification, and forecasting [7]. The association AI-RPA is suitable in different marketing sectors, such as finance and banking [8]-[10], thus suggesting the application also in other sectors as for the analysed case study. RPA is strictly connected to AI [11]-[12], and is suitable to construct workflows [13], to select processes [14], to digitize transactions [15], and in different cases requiring document management automation [16]-[21]. Document recognition

by AI, can support data flow automation [22]-[23]. Automation process of practices is an industrial research topic for companies working in services and implementing association rules to improve contract classification [24]. Moreover, data warehouse and software integration such as Enterprise Resource Planning (ERP) and Customer Relationship Management (CRM), play an important role for the company Business Intelligence (BI) [24]-[26]. In this technological scenario, innovative platforms oriented on company performance integrates software tools and Key Performance Indicators (KPIs) [27]-[28], improving production activities. Production processes can be modelled and simulated by Business Process Modelling Notation (BPMN) approaches [29], suitable to map “AS IS” and “TO BE” processes [30]. The analysed state of the art, highlights that different tools can be implemented to realize an Information Technology (IT) collaborative framework, controlling and simulating company core-processes. Following the technological scenario, has been developed the Smart District 4.0 (SD 4.0) project, initiative funded with the contribution of the Italian Ministry of the Economic Development, sustaining the digitization process of the Italian Small Medium Enterprises (SMEs), by focusing the experimentation on a pilot company (GEMITEX srl), leading in the national and international market for the production and marketing of tablecloths, cushions, chair covers, ironing board covers, carpets, bathroom and kitchen furniture, doormats, sheets, quilts, curtains and other items for home. The pilot company manages different subcontractors. For this purpose, the main process to optimize is the subcontractor’s management by means of Decision Support System (DSS) based on priority rules and KPIs. This is possible by digitizing information by RPA. A further important requirement of the pilot industry, is to have graphical dashboards based on AI predicting sales. Following the company's need, the IT platform is designed for the case of study to trace production and marketing activities, and to optimize subcontractor’s management. The paper follows the development of the project stages describing:

- “AS IS” scenario of the pilot company managing subcontractors;
- design of the “TO BE” business model obtained adding SD 4.0 digital facilities;
- design of the experimental platform describing, by means of a Unified Modeling Language (UML) Use Case Diagram (UCD), all the data fluxes involving the actors of the whole systems;
- interfaces of the platform about some important functions including RPA, and subcontractors’ monitoring dashboards;
- experimental results about Konstanz Information Miner (KNIME) sales prediction by comparing results of different AI algorithms.

2. “AS IS” AND “TO BE” PROCESSES AND UML PLATFORM DESIGN

In the preliminary analysis of the “AS IS” process, emerges that the pilot company (GEMITEX srl) carried out production starting with the receiving of orders of items having particular technical-functional and aesthetic characteristics, which can be selected from a catalogue or according to customer specifications. Upon receipt of the customer order, the latter was inserted into the Enterprise Resource Planning (ERP) system, making available the total production data, and sub data sheets to be distributed to the various subcontractors. For 99% of cases, each process necessary for the realization of a product in the catalogue corresponds to a single specialized subcontractor. For each subcontractor a long-term loyalty relationship is established. In the event that a process can be carried out by several actors, the subcontractor is selected by evaluating his workload. The workload of subcontractors was acquired through telephone communication. The logistics for the delivery of materials to subcontractors, was carried out by an employee who coordinates the suppliers by telephone (date and time of ready products, volumes, etc.), providing usually a time delay because the telephone call does not always guarantee an answer. In Fig.1 (a) is illustrated the “AS IS ” architecture of the operating model

for subcontractor's management. The SD 4.0 platform, sketched in Fig. 1 (b), through a user-friendly user interface is able to manage each individual order, by analysing the data flow of the whole supply chain, and by managing the activities of order initiation, plans, executions, and order processing in each phase. The new platform allows the pilot company to monitor, through a control checklist, the percentage of progress of the work performed and to conduct detailed analysis on each task in progress. Moreover, the platform provides a statistical analysis of the performed work (load on subcontractors, causal on the problems, etc.) through graphical dashboards tracking the order in each step.

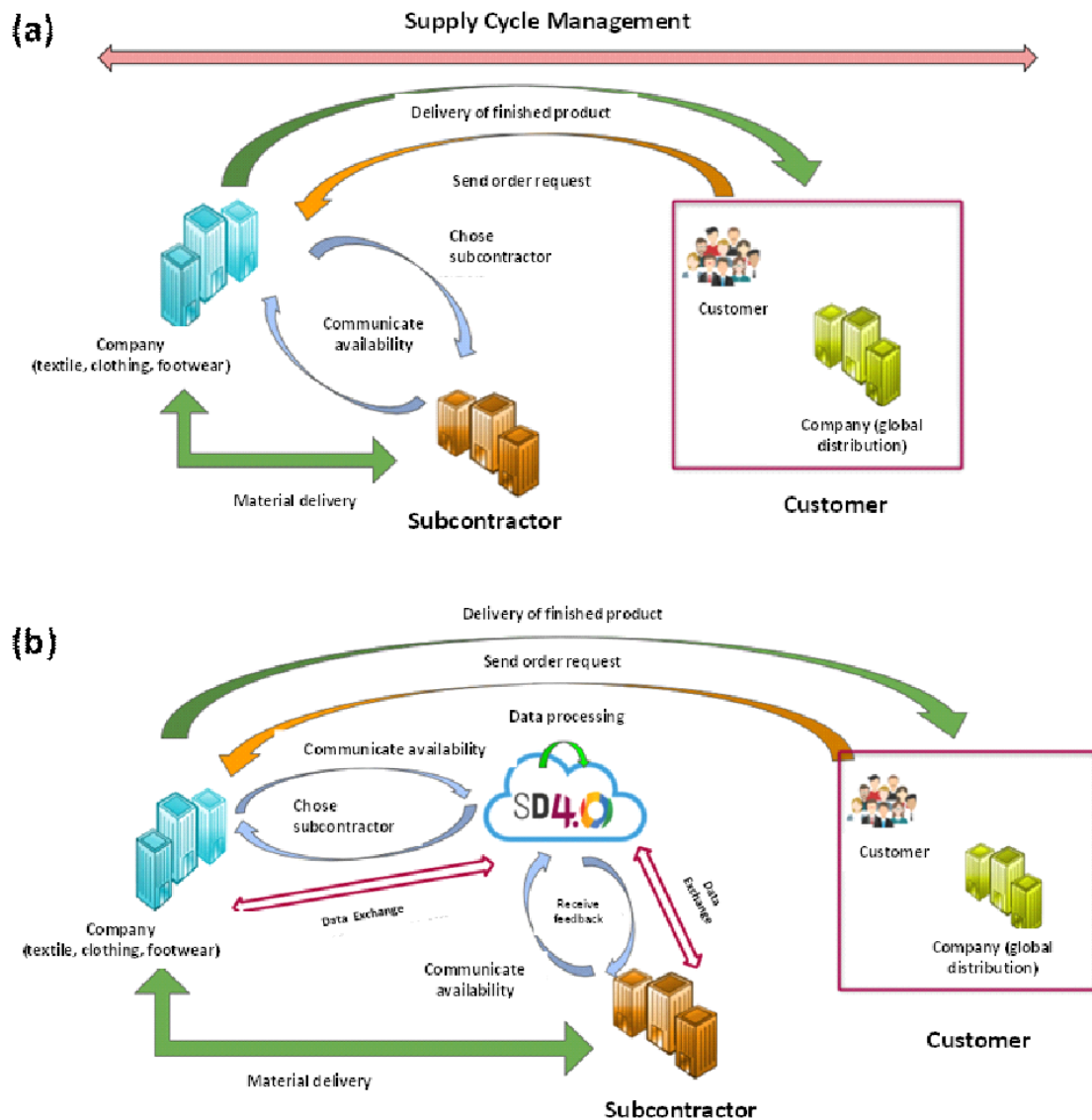


Figure 1. (a) "AS IS" and (b) "TO BE" main architectures.

As shown in the BPMN "AS IS" processes of Fig. 2 and Fig. 3, most of the activities in the GEMITEX srl pool was carried out by internal staff, with a very low automation level. It is then possible to intervene on the first activities of the process, carried out after receiving the order from the customer, by automating the process of data insertion in the ERP system matching with the order template. The first improvement goal of the "TO BE" process is then to reduce the

workload of operators, and to allow the automatic processing of production sub-sheets starting from the total production sheet. After the creation of the production sub-sheets (sub-datasheet), the individual sub-orders must be assigned to the specific subcontractors, specialized in the processing necessary for the creation of the items concerning the order. For the monitoring of subcontractor assigning process, it is necessary, before to check the availability of the subcontractor, to carry out the processing within the required time. The verification of the subcontractor's workload was previously carried out by telephone by the GEMITEX srl operators. For this purpose, a goal of the "TO BE" process is to show the subcontractors availability immediately by automating the checking process. In the new process, the subcontractors can be enabled to interact with the SD 4.0 platform, through dedicated users in order to be able to enter digitally their work commitments on a digital calendar. In this way, the SD 4.0 platform can record the availability of all subcontractors, thus guaranteeing a simplified management of the same and with a low number of interactions. Although, in the previous process, the same types of processing were assigned most of the time to the same subcontractors, and a human operator was always employed in the assignment of subcontracts to subcontractors. A further improvement goal of the "TO BE" scenario, is then to automate the assignment of sub-orders by exploiting self-learning techniques on the historical data of the assignments, leaving the human operator only to validate the proposed assignments. In the previous process, there was a not well-structured order priority management of subcontractors. This management was based mainly on the experience of the GEMITEX srl operators managing the priority order variations by phone. In this direction, the process improvement is in the automatic management of the notification of the order priorities to manage subcontractors the related suborders. The "AS IS" process of Fig. 2 explains in detail the activities performed by the company for the management of the orders and suborders: the process started from the GEMITEX srl pool which acquires from the ERP the information of the order to know the processing status. If the processing is not yet started, the company prepares the material and sends it to the subcontractor for the processing, otherwise contacts the subcontractor by telephone to get an update on the percentage of progress. Depending on the workload, and therefore the availability of the moment, the subcontractor could reject the call or answer the phone. In the first case, the company does not receive any information and is forced to call back at a later time. In the second case the subcontractor analyses the request of the pilot company, retrieves the data relating to the asked order and, finally, communicates the percentage of progress of the work. The company analyses the processing status and, if the deadline is not respected, discusses by telephone with the subcontractor to identify together problems for an agreement about a recovery action. When the subcontractor completed the processing phase and the sub-order, himself prepares the materials for delivery, and contacts the company by telephone to communicate product availability and the related characteristics (volume, weight, etc.). The "AS IS" process ends with the organization of the external logistics by checking the availability of transport vehicles, and by communicating to the subcontractor information (date and time).

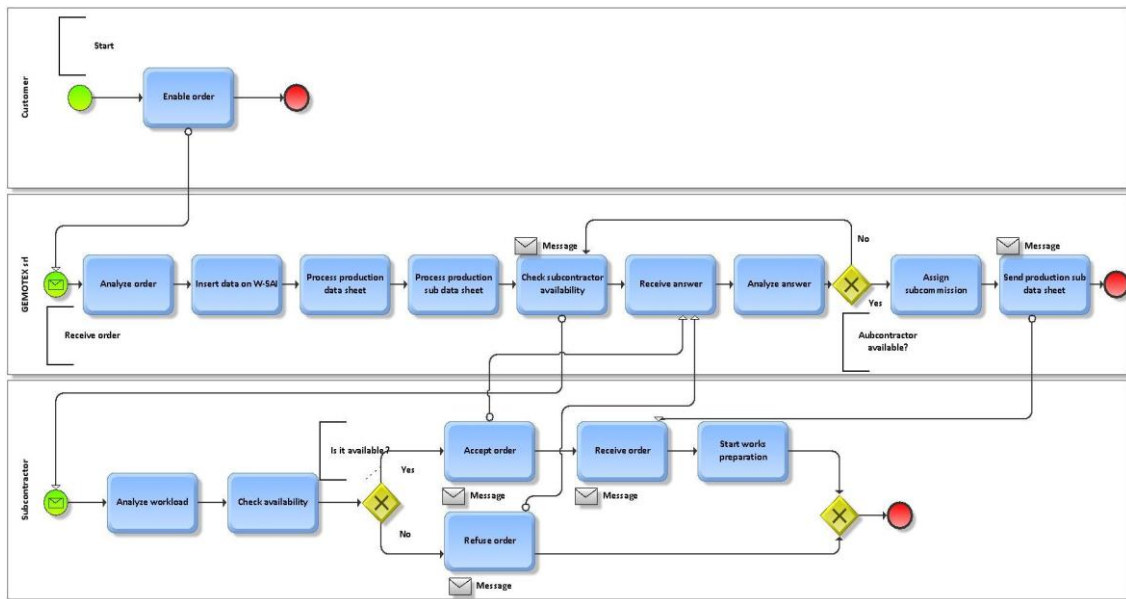


Figure 2. BPMN model: “AS IS” order and sub-order management process.

In the “AS IS” process of Fig. 3, it is observed how the management of the orders and of the suborders is a manual process carried out by an operator: it is evident that there is a no real-time monitoring of orders, that any delays in processing are almost always discovered after their occurrence, making recovery actions difficult. So, it is important to reduce manual activities of operators by allowing the real-time monitoring of the progress of orders and suborders through the SD 4.0 platform, building a synoptic dashboard, tracking activities and sending automatic alerts via the platform if the set deadlines are not respected. In the “AS IS” process there is not any activity to evaluate the performance of the subcontractor who worked on a suborder: the merit assessments of the various subcontractors are not formalized and historicized, remaining only in the memory of the operators who followed the process and carried out the checks. The introduction of subcontractor's KPIs, therefore becomes useful for their efficient assignment. Finally, in the “AS IS” process there is not an assistance service provided to subcontractors when problems arise during the processing phases: any problem could cause a production block to be resolved through only a telephone call. In this direction, a chatbot virtual assistance is able to allow the subcontractor to quickly receive possible solutions and resume work in a short period of time.

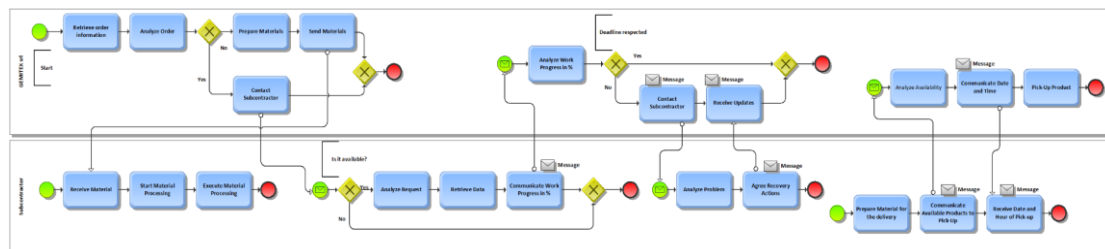


Figure 3. BPMN model: “AS IS” process of orders and sub-orders management process.

The engineering of the production process (“TO BE” process), starts with the digitization process of the production sheet which represents the first important stage to digitally control the company processes. When GEMITEX srl receives an order request, the platform generates a "total production sheet" through the ERP, containing all the information such as, customer, delivery

date, quantity, etc. By solving the criticalities of the “AS IS” analysis, the SD 4.0 project platform includes different functions such as:

- automatic processing of production sub-sheets;
- the check on the technical skills and availability of the subcontractors to carry out one or more processes;
- automatic evaluation of KPIs;
- choice of subcontractors to whom to entrust sub-orders;
- storage of subcontractor / product associations;
- automatic sending of order request notifications.

The “TO BE” process begins when the pilot company uploads the total production sheet in pdf format into the SD 4.0 platform data warehouse, by means of an RPA tool, able to analyse its content, and creating automatically the production sub-sheets, containing a set of products that subcontractors must create or make available. The technical specifications for the processing of the individual products and the deadline are information contained in the production sheet, which are reported in the production sub-sheets together with the order priority and the estimated processing time. Once the automatic creation of the sub-sheets has been completed, the platform transmits them to the pilot company which assigns the priority and the estimated processing time to complete the sub-order; in this way the subcontractor who receives more orders is able to independently manage the priorities considering the company needs. The subcontractor list is filtered based on the of the subcontractor to produce the required items (the availability is identified by considering the time required for the order processing and the deadline). The platform sorts the list of subcontractors in order of performance by evaluating the average of the KPIs of each one. Finally, the platform assigns the suborder to the first subcontractor of the updated list, stores the subcontractor/product associations validated by the pilot industry, and automatically sends the notification of the order request to the subcontractor. In Fig. 4 is illustrated the graphic representation of the new process managing orders and suborders. The order management process allows the company to monitor the progress of each suborders and to organize logistics. The indicators estimated by the platform are:

- job order and suborders progress monitoring (% of progress);
- alert on sub-order delays;
- logistics management for the delivery of raw materials;
- logistics management for the collection of semi-finished products.

GEMITEX srl, through the SD 4.0 platform, selects the order of interest from the list of all active orders, or enters the Identification Number (ID) of the same directly in the search field. The platform receives the input, analyses the order number, retrieves the corresponding information, and returns the data of the associated production sub-sheets and of related subcontractors. At this point, the company selects the sub-sheet of interest and follows the progress of the work. If the processing is not yet started, the company prepares the material and sends it to the subcontractor, who executes the work by recording the processing progress percentage on the SD 4.0 platform. This process guarantees GEMITEX srl, the real-time monitoring of the progress of the suborder which is always updated. At the end of the process, the subcontractor prepares the material for delivery. When the percentage of progress of the suborder corresponds to 100%, the platform sends a notification informing the process completion. If the processing is not finished, the platform performs a check by considering the processing status and the deadline. If the subcontractor does not complete the processing the day before the order deadline, an alert notification is sent.

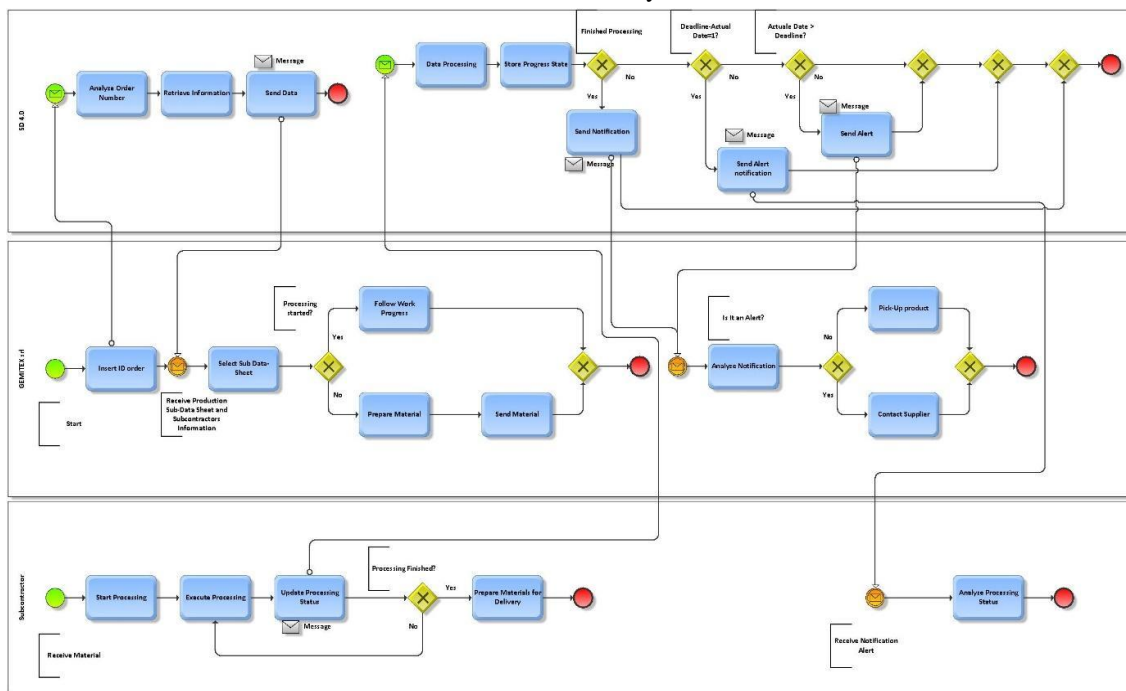


Figure 4. BPMN model: “TO BE” process of orders and suborders management.

Through the SD 4.0 platform, the process allows also the storage of opinions (feedback) expressed by the pilot company regarding subcontractors: (i) the company, having received the final product, enters the order ID in the SD 4.0 platform for the purpose of compiling and sending feedback; (ii) a screen of the sub-orders belonging to the order ID and the related subcontractors is automatically generated; (iii) the KPIs output are added in the platform (time, number of delivers in advance or in time with respect to the deadline, total number of deliveries, total number of compliant products, total number of products). The BPMN process describing subcontractors feedback system is illustrated in Fig. 5.

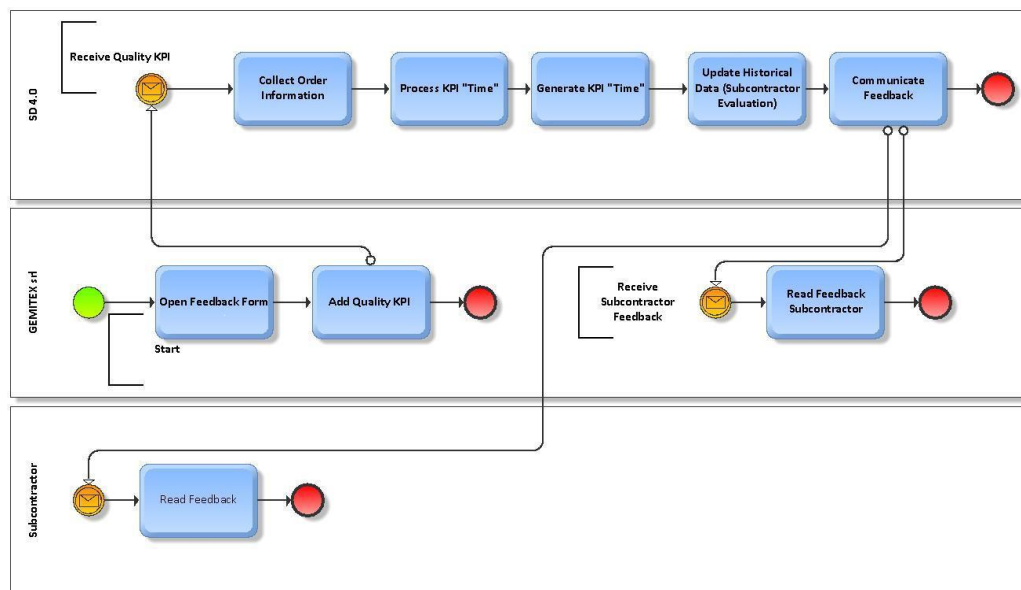


Figure 5. BPMN model: “TO BE” process subcontractors feedback system.

In Fig. 6 is illustrated the UML UCD diagram representing the whole dataflow of the SD 4.0 platform, matching with the “TO BE” process, and involving all system actors such as subcontractors, customers and the pilot company.

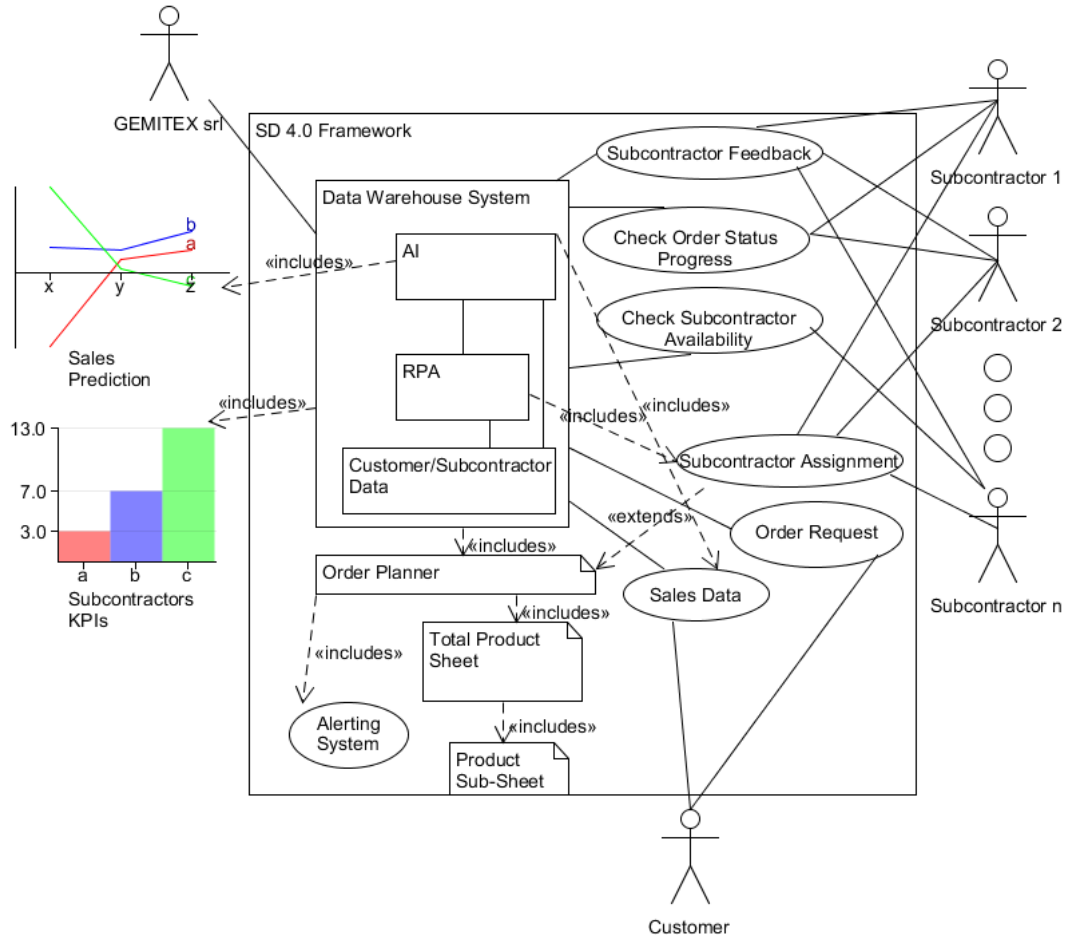


Figure 6. UML UCD diagram describing actors' dataflow of the SD 4.0 platform and related functions.

3. SD 4.0 PLATFORM IMPLEMENTATION OF INTERFACES FOR SUBCONTRACTORS MANAGING

A main goal of the platform, is to create the production sub-sheets starting from the total product sheet by considering the following requirements:

- the sub-sheets are easily identifiable by image features recognition, because a white line is inserted between one and the other in the total product sheet (which precisely marks the transition from one sub-tab to the other);
- the order is divided into suborders based on the involved subcontractors;
- to each subcontractor can be associated with more products.

In Fig. 7 is illustrated a typical document layout to scan and to digitize for the automatic creation of production sub-sheets. The RPA in this case is able to recognize the layout features, thus generating the interface output of Fig. 8, where the user is able to add subcontractors' priorities.

The DSS engine of the platform is able to identify the white raw scans consecutively the patterns (table layouts), by distinguishing subcontractors' assignments and assigning processing priorities. In Fig. 9 (a) and Fig. 9 (b) illustrating the SD 4.0 dashboards outputs about order processing status and scheduling. The feedback scoring of subcontractors can be visualized by the dashboard of Fig. 10. The scoring represents a very important KPIs, and it is also important for decision making to assign priorities in the future assignments.

Total
production
sheet

Dati: GEMTEX SpA VIA N. BARRATO, 2 76123 ANDRIA (BT) 04419210729		(Prov. 830561474612)		SCHEDA DI PRODUZIONE 19_006322				Pag. 10	
		Cliente: 05195 XXXXXXXXXXXXXXXX - SEGOVIA-ESPANIA							
P.201: NOTULE/NOTE: COSSIERE; DUV-BARILETTA		Nr. ordine interno: 000004745 Nr. ordine cliente: 19_006322 Data di emissione: 27.08.19 - Data di consegna: 10.09.19		Nazione: SPAGNA		TUTTO COD EAN			
		NOTULE/NOTE: TUTTI GLI ARTICOLI CON CODICE EAN X COLORE INVIARE SOLO MERCE DISPONIBILE TUTTO CON INSERITI NON SI POSSONO SOSTITUIRE I DISSEGNI							
Descriz.	Materie	Altre note	Packing	Codice	Colore	Imb.	Car.	Apparec.	Quantità
AUTOP STOP H.60 NERO 705B6003 IMP = SEGOVIA71H6003	H.60 NERO			NERO	80142009502054	XZ	1		NOTOGG DA 20 MT.
TOVALLI CLASSIC H.140 70114094 IMP = SEGOVIA71H140	H.140 CLASSIC			70114094	80142009509349	XZ	1		NOTOGG DA 20 MT.
TOVALLI CLASSIC H.140 70114111 IMP = SEGOVIA71H111	H.140 CLASSIC			70114111	80142009513977	XZ	1		NOTOGG DA 20 MT.
TOVAGLIANO FEVA H.140 719H1405 IMP = SEGOVIA71H1405	FEVA H.140			719H1405	80142009509427	XZ	1		NOTOGG DA 20 MT.
TOVAGLIANO FEVA H.140 719H1407 IMP = SEGOVIA71H1407	H.140 FEVA			719H1407	80142009509451	XZ	1		NOTOGG DA 20 MT.
TOVAGLIANO FEVA H.140 719H1409 IMP = SEGOVIA71H1409	H.140 FEVA			719H1409	80142009509475	XZ	1		NOTOGG DA 20 MT.
TOVAGLIANO FEVA H.140 719H1410 IMP = SEGOVIA71H1410	H.140 FEVA			719H1410-RUBINI	80142009509482	XZ	1		NOTOGG DA 20 MT.
White row (sub-sheet end)									
TAPPETO VARCA C/AFFINIZIONE REC = 02110CASAQWAP	VARCA	C/AFFINIZIONE		BIANCO	80142009013809	PZ	12		AMB.-C/AFFINERE E PAGG RTT.ES.12
TAPPETO VARCA C/AFFINIZIONE REC = 02110CASAQWAP	VARCA	C/AFFINIZIONE		GRIGIO	80142009494972	PZ	12		AMB.-C/AFFINERE E PAGG RTT.ES.12
TAPPETO VARCA C/AFFINIZIONE REC = 02110CASAQWAP	VARCA	C/AFFINIZIONE		ROSA	80142009494985	PZ	12		AMB.-C/AFFINERE E PAGG RTT.ES.12
TAPPETO VARCA C/AFFINIZIONE REC = 02110CASAQWAP	VARCA	C/AFFINIZIONE		MAURONE	80142009494938	PZ	12		AMB.-C/AFFINERE E PAGG RTT.ES.12
TAPPETO VARCA C/AFFINIZIONE REC = 02110CASAQWAP	VARCA	C/AFFINIZIONE		CHLORITE	80142009494941	PZ	12		AMB.-C/AFFINERE E PAGG RTT.ES.12
White row (sub-sheet end)									
TAPPETO DOCCIA C/AFFINIZIONE REC = 02110CASAQWAP	DOCCIA	C/AFFINIZIONE		BIANCO	80142009013799	PZ	12		AMB.-C/AFFINERE E PAGG RTT.ES.12

Sub-sheet 1

Sub-sheet 2

Sub-sheet 2

Figure 7. Total product sheet and automatic procedure to create a sub-sheet.

Home

Board

Task

Processi

File

Compilatore?

Da fare

Stato

Da fare

Titolo

Verifica assegnazione terzisti ed attribuzione priorità - 000006623

Utente

Descrizione

Data consegna

15/01/2020

ID Sottoscheda	Descrizione	Quantità	Tempo lavorazione (gg) *	Terzista *	Priorità *	Dettagli
5649205632996320	TOVAGLIA FELPATA 100X1	100	3	terzista1@gemitex.s440.io >		
ID Sottoscheda	Descrizione	Quantità	Tempo lavorazione (gg) *	Terzista *	Priorità *	Dettagli
5650043017101312	TOVAGLIA FELPATA 140X1	100	4	terzista2@gemitex.s440.io >		
ID Sottoscheda	Descrizione	Quantità	Tempo lavorazione (gg) *	Terzista *	Priorità *	Dettagli
5660338458700803	SEMFINITO MADRAS H 5t	20	2	terzista3@gemitex.s440.io >		
ID Sottoscheda	Descrizione	Quantità	Tempo lavorazione (gg) *	Terzista *	Priorità *	Dettagli
5660707490208762	TOVAGLIA FELPATA ROT. *	100	1	terzista1@gemitex.s440.io >		
ID Sottoscheda	Descrizione	Quantità	Tempo lavorazione (gg) *	Terzista *	Priorità *	Dettagli
5722207187150848	TOVAGLIA FELPATA 140X200F	100	5	terzista		

Salva

Figure 8. Interface output of the SD 4.0 platform providing subcontractor sub-sheets with priority field (“Priorità”).

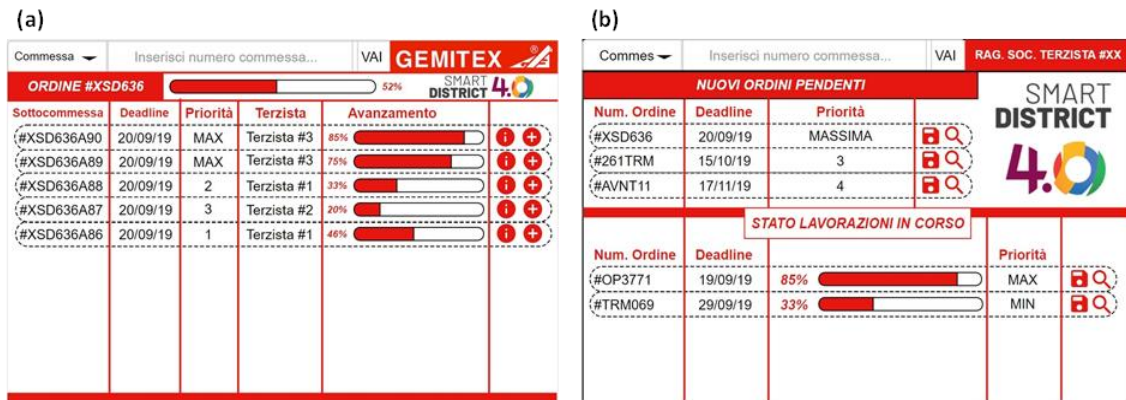


Figure 9. (a) Graphical dashboard indicating subcontractors ("Terzista") processing status. (b) Order scheduling indicating processing status and priorities.

Figure 10 is a screenshot of a web application interface titled 'Piattaforma SD40_Feedback Terzisti'. It features a search bar for 'ID_COMMESSA' and a 'GEMITEX' logo. The dashboard displays four feedback forms for subcontractors. Each form includes fields for 'ID_Sottocommissa', 'Rif. Terzista', 'Tempo' (5 stars), 'Qualità' (5 stars), and a 'Multi-line textarea' for comments.

Figure 10. Dashboard for subcontractor feedback provided by Gemitex srl (subcontractor KPI).

4. EXPERIMENTAL DATASET AND MACHINE LEARNING APPLICATION: SALES PREDICTION DASHBOARDS

A further function of the realized platform is the availability of sales prediction graphical dashboards. Experimentation about sales prediction is performed by processing GEMITEX srl dataset collected into the SD 4.0 data warehouse. The dataset is composed by following main attributes:

- *Fatturato_doc_rif_documento*: document code;
- *Fatturato_doc_data*: sales date;
- *Fatturato_doc_cod_nazione*: code identifying sales in national territory;
- *Fatturato_doc_des_nazione*: code identifying possible nations;
- *Fatturato_doc_des_zona*: code identifying sales in each region;

- *geo_provincia_cliente*: indicates the province of the region in which the sales are recorded;
- *Fatturato_doc_cdart*: this attribute highlights the number of invoices associated with particular types of products;
- *Fatturato_doc_dsart*: this attribute indicates the number of invoices that are associated with particular types of products;
- *Fatturato_doc_prezzo_lordo*: gross unit price;
- *Fatturato_doc_perc_sconto_medio*: recurring discounts within the represented dataset;
- *Fatturato_doc_prezzo_netto*: net price of the products that have been sold;
- *Fatturato_doc_valore_venduto*: represents the amount of total sales following the application of the discounts.

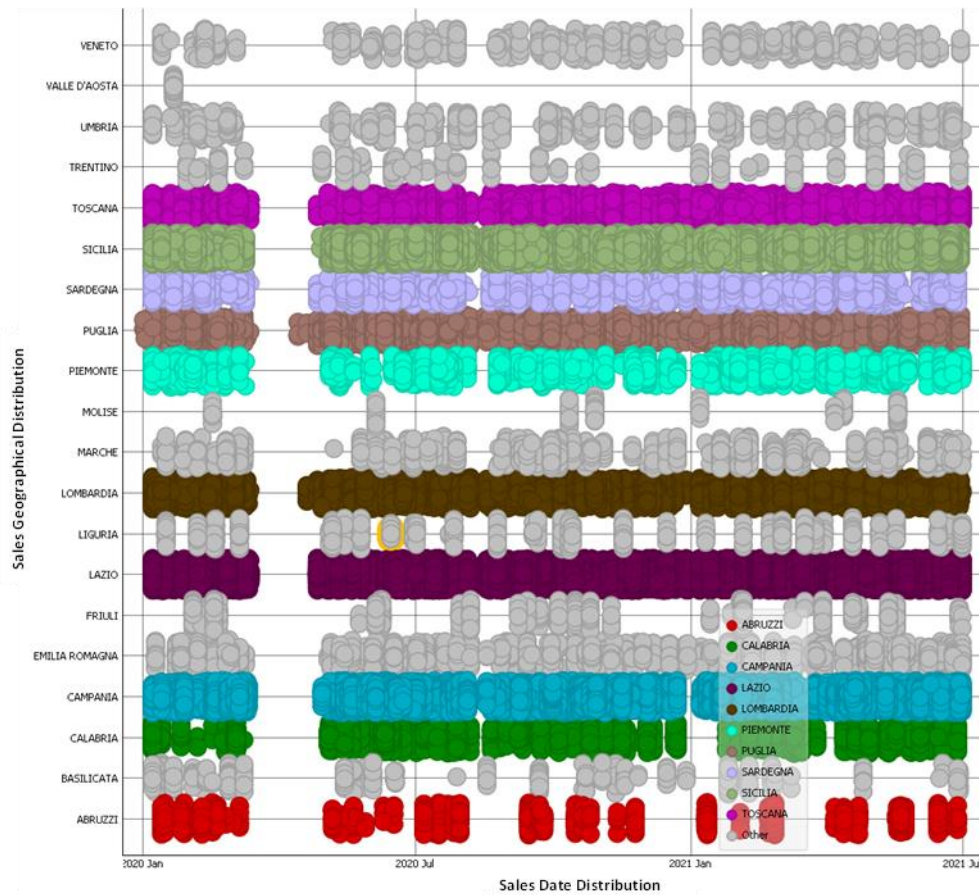


Figure 11. Plotting of the experimental dataset.

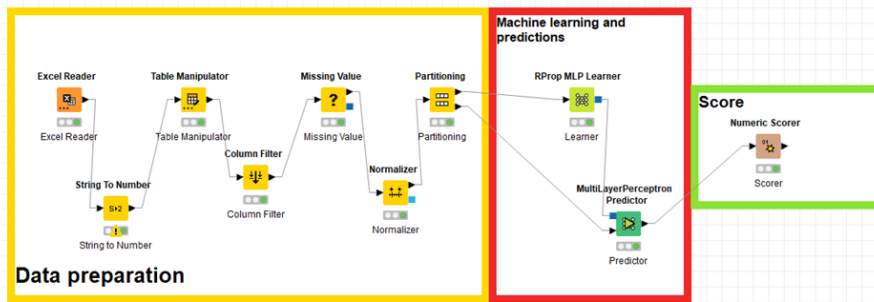
Different objects oriented open source tools [31]-[34], can be adopted for the prediction of the total product quantity (key-attribute defined as labelled class in the AI supervised algorithm), thus predicting sales of the pilot company. The tool adopted for calculus is KNIME [33]-[36], able to test the dataset model, by Artificial Neural Network (ANN) Multilayer Perceptron (MLP), the Simple Regression Tree (SRT), and the Linear Regression (LR) [37] approaches. In Table 1 are indicated the Mean Absolute Error (MAE) values for each tested algorithm, where ANN-MLP exhibits the best performance, adopting KNIME standard hyperparameters and setting.

Table 1. MAE comparison between different data mining algorithms.

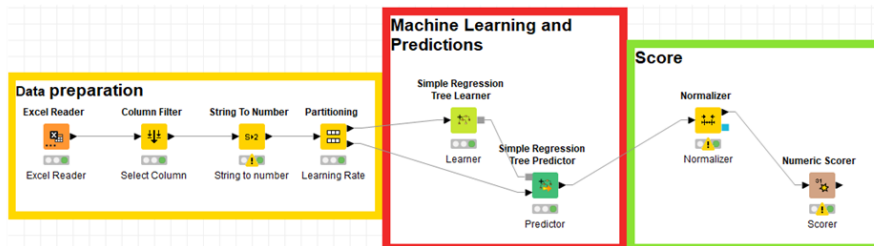
MAE Ranking of algorithms			
Rank	Algorithms	Standard Hyperparameters and algorithm setting	MAE
1	ANN-MLP	Maximum number of iterations = 100; number of hidden layers = 1; number of hidden neurons per layer = 10; first dataset partition = 70 % (training dataset); second dataset partition = 30 % (testing dataset).	0,00123
2	SRT	Use binary splits for nominal attributes; missing values handling (XGBoost)	0,06766
3	LR	Missing values are not considered in the calculus ('fain on observing missing values')	0,16441

In Fig. 12 (a),(b), (c) are illustrated the KNIME workflow executed for ANN-MLP, SRT algorithms, respectively.

(a)



(b)



(c)

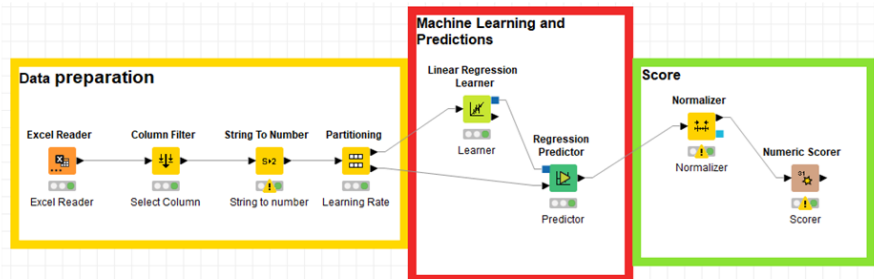


Figure 12. KNIME workflows: (a) ANN-MLP; (b) Simple Regression Tree Learner; (c) Linear Regression.

At this point it is improved the optimization of the ANN-MLP model by following the MAE minimization approach discussed in [31], finding the best hyperparameters performing a MAE of 0,00113 (maximum number of iterations = 700; number of hidden layers = 3; number of hidden neurons per layer = 12). In Fig. 13 (a), (b) and (c) are indicated the steps followed during the calculus to find minima conditions. The optimized ANN-MLP model is adopted to estimate the level quantity as a function of price. Specifically, in Fig. 13 (d) is predicted the product quantities Q as a function f of the invoice P ($Q=f(P)$). The prediction shows that there are two different characteristics of the predicted data:

- there is a main intensive interval in which quantities are between the denormalized value of 7.827 and 7.920;
- there is a growth in the maximum value of quantities that can be sold positively associated with the increase of values with the records chronologically sorted (estimation in a period of about 5.4 months).

Specifically, in Fig. 13 (d), it is clearly identified the quantities that are more recurrent under the yellow line.

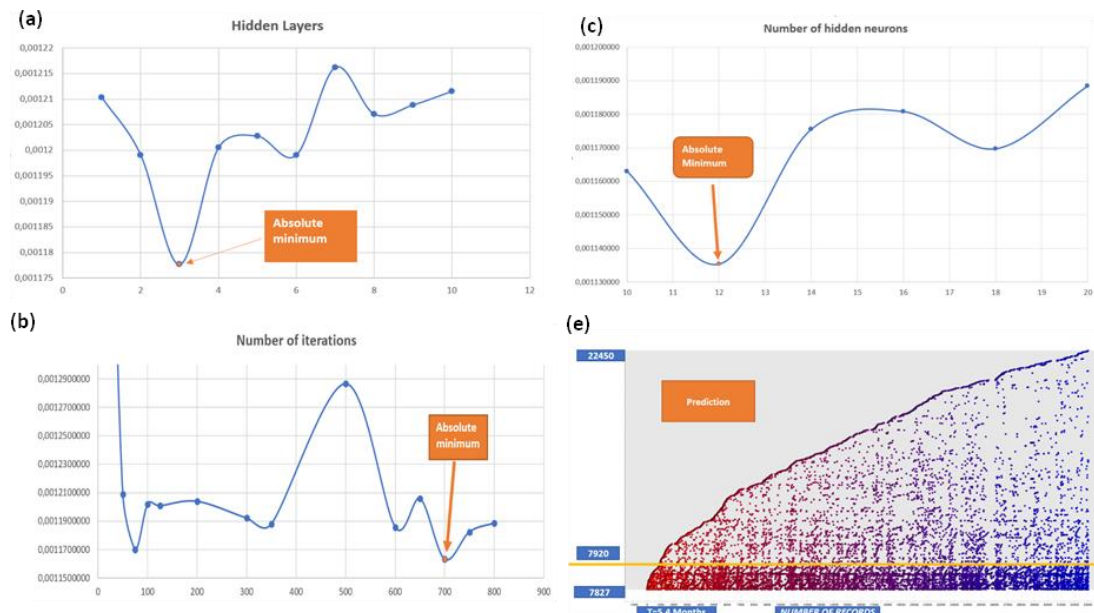


Figure 13. (a), (b), (c) MAE minimization approach [34],[36] (training dataset partition = 70 %; testing dataset partition = 30 %): (a) MAE versus hidden layers number; (b) MAE versus iterations number; (c) MAE versus numbers of hidden neurons per layer. (d) Prediction of quantities versus the number of the records chronologically sorted:

The prediction of quantity as a function of price: the x-axis is representative of the number of records; the y-axis is representative of the quantity; specifically, it is found that there is a main interval in which the main part of records resides that is included in the interval 7.827-7.920 under the yellow line in the graph; the same graph also shows the presence of another characteristic of the dataset, i.e. the tendential growth of the maximum amount of quantity per number of records.

In Fig. 14 is illustrated the ANN-MLP architecture of the optimized predicting model.

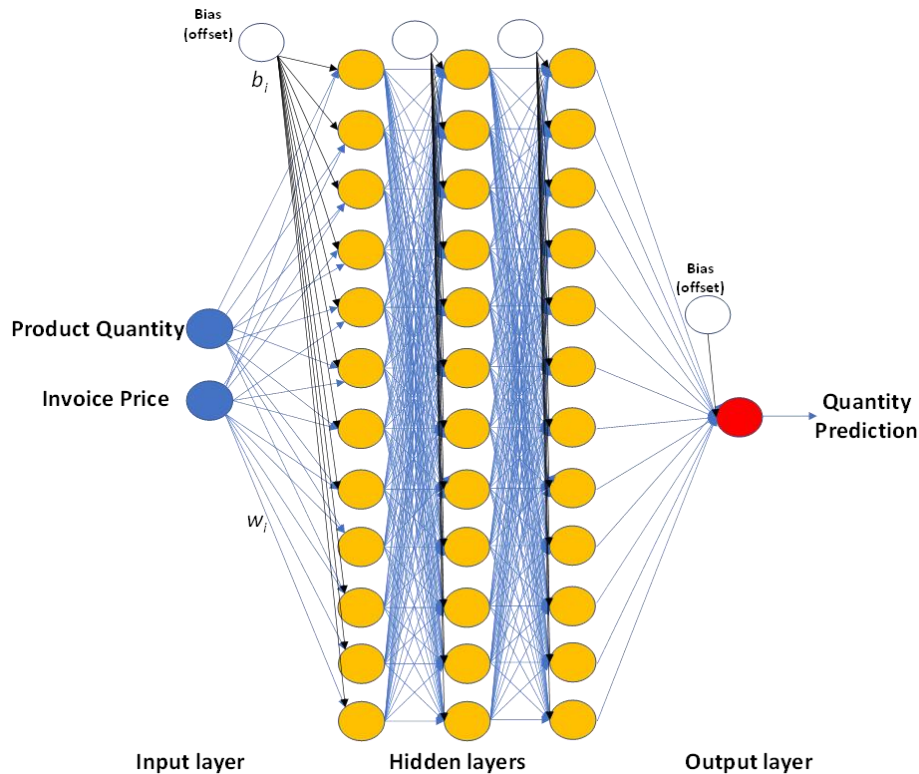


Figure 14. Optimized ANN MLP network adopted for quantity prediction.

5. CONCLUSIONS

The proposed paper describes an innovative platform implementing engineered processes of a company working in the textile sector. Specifically, the SD 4.0 is able to efficiently manage subcontractors and orders, by means of intelligent digital document processing tools and graphical KPIs, by indicating processes progress status with alerting system, and subcontractors' performances. The management of subcontractors is optimized by an engineered process enabling automatization and a dynamic scheduler tracing the order status and subcontractor activities. The platform behaves as a DSS, providing also important advanced analysis such as sales prediction. Different algorithms such as ANN-MLP, SRT and LR, have been tested by comparing performances. The results select as best predictor the ANN-MLP approach, able to minimize the MAE. Finally, using an optimized ANN-MLP model, it is predicted the product quantity sold in a period, by providing further graphical dashboards useful for managers. The platform is properly developed for the case study, and the related database is linked to open source KNIME workflow for data analysis. The pilot study is useful to understand the approaches and the methods to follow to improve intelligence into software tools oriented on the optimization of management of activities of the whole supply chain.

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AUTHORS

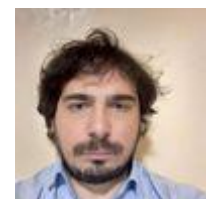
Nicola Magaletti, Business development manager with a degree in mechanical engineering with over 30 years of work experience in structured companies, for which he works in the management of innovation processes and in the launch of new business initiatives in the industrial consultancy sector. Since 2018 he has been part of the Lum Enterprise team as Operational Manager and Technical-Scientific Manager of the "Smart District 4.0" R&D project of which the company is the lead.



Gabriele Cosoli, Senior IT Specialist and Solution architect with a degree in Computer Science and over five years of previous experience, specialized in the analysis and design of ICT solutions in various application areas and technological frameworks. Certified on "Machine Learning by Stanford University on Coursera" Master on "Agile and Digital Project Management - Advanced Course" at 24ORE Business School.



Angelo Leogrande, Senior IT Specialist and Solution architect with a degree in Computer Science and over five years of previous experience, specialized in the analysis and design of ICT solutions in various application areas and technological frameworks. Certified on "Machine Learning by Stanford University on Coursera" Master on "Agile and Digital Project Management - Advanced Course" at 24ORE Business School.



Alessandro Massaro, Professor Alessandro Massaro (ING/INF/01, FIS/01, FIS/03) carried out scientific research at the Polytechnic University of Marche, at CNR, and at Italian Institute of Technology (IIT) as Team Leader by activating laboratories for nanocomposite sensors for industrial robotics. He is in MIUR register as scientific expert in competitive Industrial Research and social development. He was the head of the Research and Development section and scientific director of MIUR Research Institute Dyrecta Lab Srl. Member of the International Scientific Committee of Measurers IMEKO and IEEE Senior member, he received an award from the National Council of Engineers as Best Engineer of Italy 2018 (Top Young Engineer 2018). He is currently researcher at LUM Enterprise srl, and professor at LUM University Libera Università Mediterranea "Giuseppe Degennaro".

