

## MOTIVATION

Aelsan Inc. is one of the companies with the widest product range in terms of material and project diversity. Each material that needs to be supplied is an important place for the process because the characteristics in the procurement of raw materials and semi-finished products required for production cause delays in the delivery of the final product, directly or indirectly, and financial loss. The aim of the project that we do with Aelsan Central Supply Chain Directorate is to analyze the material procurement process and to present sustainable solutions based on the results of the analysis.

## MATERIAL PROCUREMENT PROCESS



## DATA



## SYSTEM ANALYSIS

- It was seen that 80% of the materials' early, late, timely arrivals were highly correlated with the time given for production. In other words, when the time given for production is given less than a certain limit (i.e., when the order is created late) the order came late. The duration of delayed time decreases as the given time for production increases.
- 153 of the materials have more than one supplier while the rest has only one supplier. The number of suppliers of the materials range from one to twelve. Lead times differ from supplier to supplier.
- Data were analyzed in order to observe the change in the lead time and order quantity by months and years. It is observed that order creation date, year and month, have an effect on the lead times.
- Analyses were made to observe whether the unit price of an order depend on the order quantity and the lead time. For this purpose, correlation analysis was performed for each material and it is observed that there is generally a negative correlation between the lead time and the unit price as well as between the order quantity and the unit price.

As a result of analyses, the factors, which have direct effect on the lead time, were determined:

Lead Time - Supplier, Month and Year, Order Quantity, Given Production Time

## PROBLEM DEFINITION

The main problem is defined as the inability to obtain the desired efficiency from the material procurement process. 49% of the orders between 2014-2018 were reached early, 30% were late and the remaining 21% reached to the company as time. The total cost of the orders were \$87 million, \$76 million, and \$25 million. In case of early arrival of orders, keeping the materials within the company until the requirement date causes a significant increase in inventory holding costs. In case of delay of the orders, production cannot be started on the desired date and the project calendar can be disrupted. The delays in the project calendar causes that the firm pays the financial penalty for each delayed product according to the agreement with the customer.

## Current System

- The planned delivery time is used by the production planning personnel and the orders are expected to be created according to this time.
- It is a constant number that does not change according to different factors.
- It is created based on experience.



## Proposed System

- The planned delivery time is used by the purchasing personnel. The planning personnel creates the orders according to the Planning Horizon.
- PDT is calculated according to different factors.
- PDT is created based on mathematical methods.



## METHODOLOGY

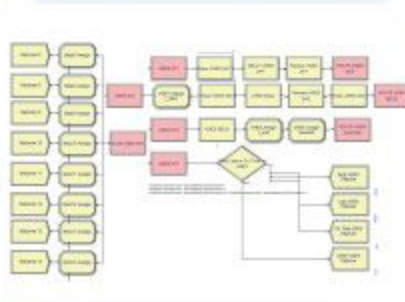
- Data Preprocessing**
  - Obtained information is used in data analysis process
  - Extraction of orders that the entry of material hasn't been done yet
  - Extraction of orders that created for re-work
  - Removal of outliers based on some features
- Machine Learning Models**
  - Regression models were decided to be used because the lead time is continuous values.
  - Machine learning regression models were created to make accurate estimation of material arrival times. The main purpose of these models is to create a learning algorithm on the training dataset that can best estimate the material arrival times and to obtain the best estimation result in the test dataset. These models were implemented through the Python programming language.
- Decision Support System**
  - A user-friendly computer-based interface has been developed to enable the company staff to use the results of prediction as a result of machine learning methods. In this application, firstly, a purchaser enters the stock number of the material. After that, he/she enters the supplier number and the order quantity. After entering the requirement date from the calendar window, the decision support system predicts the lead time and the interval for lead time. The system gives the date interval for purchasers to help them about purchase order creation time.
- Simulation Model**
  - The current material procurement process is simulated by using Arena program. As a result of the simulation model, the total number of early, late and timely arrived orders are obtained for 5 years. After the current system simulation, the process is simulated using the results of decision support system and the arrival situation of orders are obtained for 5 years. Finally, the increase in number of timely arrival is observed.
- Results**
  - The proposed decision support system is used for the test dataset containing 115 orders for prediction of the arrival time of the Group A critical materials.

	Before Proposed System	After Proposed System
Early Arrival Rate	27%	17%
On Time Arrival Rate	14%	33%
Late Arrival Rate	59%	50%

  - Decrease in the number of early arrival of orders decreases inventory holding cost
  - Decreased from \$ 8,400 to \$ 800



The decision support system, in addition to the prediction of the arrival time of the group A critical materials, is also suitable for predicting the arrival times of other group materials. At the same time, the system has been designed to have a wide range of functions so that company staff who work in different sectors can use it.



Material procurement process of all sectors are simulated. The figure shows below is just a part of model of UGES's material procurement process.

It is important to inform the purchaser about in what time he or she should give the order to the supplier. By using decision support system, we determined in which time interval an order should be given before the material requirement date for each material. For the intervals, we assigned accuracy rates. A purchaser can give the order by these intervals and the accuracy rates.

Result	Supplier	Proposed Lead Time Interval to Create Purchase Order (h)	Accuracy Rate of 200 h at	Actual Lead Time Interval to Supplier for Production (h)	Accuracy Rate of Order B
1	010889	10-70	82%	10-120	98%
21	210823	500-300	96%	60-1010	79%
210830	10-400	80%	10-800	84%	
31	210721	10-400	80%	70-1010	98%
310721	100-200	96%	10-1010	37%	
44	210888	100-400	71%	10-1010	87%
49	210704	110-200	88%	100-1010	84%
59	210823	100-400	71%	10-1010	84%
100	210843	10-100	88%	10-1010	84%

## REFERENCES

- Banerjee, A.S., Yang, M., Yang, D., Kundu, P., Chakrab, A. & Moha, L. (2016). A Hybrid Statistical Method for Accurate Prediction of Supplier Delivery Times of Aircraft Engine Parts. 18th Computers and Informatics in Engineering Conference, 18, Boston, ASSE.
- Liu, L., Huang, L., Yang, H., Raju, L., & Banerjee, A. G. (2018). Predicting Purchase Orders Delivery Time Using Regression Models with Decision Production. 18th Computers and Informatics in Engineering Conference, 18, Quebec City, ASSE.