





**Project Design Phase-I**  
**Proposed Solution Template**

Date	19 September 2022
Team ID	PNT2022TMID52013
Project Name	Project - Machine Learning-Based Predictive Analytics for Aircraft Engine
Maximum Marks	2 Marks

**Proposed Solution Template:**

Project team shall fill the following information in proposed solution template.

S.No	Parameter	Description
1.	Problem Statement (Problem to be solved)	<ul style="list-style-type: none"> <li>The unexpected failure of the aircraft engine components leads to increase the overall cost.</li> <li>The limitless maintenance activities such as scheduled maintenance (Corrective maintenance, Preventive maintenance, Predictive maintenance) and unscheduled maintenance.</li> </ul>
2.	Idea / Solution description	<ul style="list-style-type: none"> <li>To introduce machine learning models based on feature selection and data elimination to predict failure of the aircraft system.</li> <li>To minimize the risk factors and improvement of aircraft engine, Engine companies have generated and collected large amount of data over the years from various sources such as the database of currently development projects, previously completed development projects, and the designs that were not manufactured, are valuable for intelligence that can support new engine development.</li> <li>To anticipating rare failure within a predetermined meaningful time frame.</li> </ul>
3.	Novelty / Uniqueness	<ul style="list-style-type: none"> <li>Supervised machine-learning analytics for Aircraft engine were employed to find patterns in the database of 183 manufactured engines and engines that were studied previously in various NASA aeronautics projects.</li> <li>It minimizes risk and improve in the technological field.</li> <li>Based on the analytics airlines can know exactly what is happening, why it is happening, and what possible impact any event.</li> </ul>
4.	Social Impact / Customer Satisfaction	<ul style="list-style-type: none"> <li>The database will help the aviation industry and it will need to update for every particular period of time interval (like 10 years...).</li> <li>It will make the flight journey even safer.</li> <li>It reduces the manual checking of engine components.</li> <li>Reduces the cost of repairing.</li> </ul>

5.	Business Model (Revenue Model)	<div><p>It provides complete security about the database collected over years.</p></div> <div><p>Since the failures of the engine components were predicted earlier so it reduce the cost for replacing and repairing components.</p></div> <div><p>From the database the user get everything they needed and database will monitored by the data scientists.</p></div> <div><p>The Performance were monitored during the simulation of this model and corrections made regarding the results.</p></div>																																																																																																									
6.	Scalability of the Solution	<ul style="list-style-type: none"><li>• The development used the database of 183 manufactured engines and engines that were studied previously in NASA aeronautics projects. The TSFC predictive analytics has an average accuracy of 98.3 percent, with 3.5 percent uncertainty. The engine core-size predictive analytics has an overall accuracy of 100 percent, with 4.3 percent uncertainty. Overall, both predictive analytics show remarkable prediction accuracy.</li><li>• It would help to identify the best engine design expeditiously amongst several candidates.</li></ul> <table><tr><th>Algorithms</th><th>Accuracy</th><th>Model Complexity</th><th>Treat with Uncertainties</th><th>Computational Time</th><th>Robustness</th><th>Observations</th></tr><tr><td>ANN</td><td>Reasonably high</td><td>Reasonable</td><td>Low</td><td>Reasonably low</td><td>Reasonably low</td><td>The performance can be improved with a large amount of accurate data</td></tr><tr><td>AE</td><td>High</td><td>Reasonably high</td><td>Reasonable</td><td>Reasonably low</td><td>Reasonable</td><td>Good generalisation properties</td></tr><tr><td>CNN</td><td>High</td><td>High</td><td>Reasonable</td><td>Reasonably high</td><td>Reasonable</td><td>-</td></tr><tr><td>ELM</td><td>Reasonably high</td><td>Reasonably low</td><td>Low</td><td>Low</td><td>Low</td><td>-</td></tr><tr><td>GAN</td><td>Low</td><td>High</td><td>Reasonably low</td><td>Reasonable</td><td>Reasonable</td><td>-</td></tr><tr><td>RNN</td><td>High</td><td>High</td><td>Reasonably low</td><td>Reasonable</td><td>Reasonably high</td><td>Large amount of and sequential data</td></tr><tr><td>Bayesian Models</td><td>High</td><td>Reasonable</td><td>Reasonably high</td><td>Reasonable</td><td>Reasonably high</td><td>-</td></tr><tr><td>Clustering</td><td>Reasonably high</td><td>Reasonable</td><td>Reasonable</td><td>Reasonably high</td><td>Reasonably high</td><td>The performance can be improved by having an accurate dataset</td></tr><tr><td>Decision Tree</td><td>High</td><td>Reasonable</td><td>Reasonable</td><td>Reasonably low</td><td>Reasonably high</td><td>-</td></tr><tr><td>Fuzzy Logic</td><td>High</td><td>Reasonably high</td><td>Reasonably high</td><td>Reasonably low</td><td>High</td><td>Generalisation properties with a reasonable amount of domain expertise in the field is needed</td></tr><tr><td>Genetic Programming</td><td>High</td><td>High</td><td>Reasonably low</td><td>High</td><td>High</td><td>-</td></tr><tr><td>L and NL Regression</td><td>Reasonable</td><td>Low</td><td>Low</td><td>Low</td><td>Reasonably low</td><td>Regularisation can help to generalise the solution</td></tr><tr><td>PCA</td><td>Low</td><td>Low</td><td>Reasonably low</td><td>Low</td><td>Low</td><td>It works well only with linear data. Good performance requires pre-processing data</td></tr><tr><td>SVM</td><td>Reasonably high</td><td>Reasonably low</td><td>Reasonable</td><td>Low</td><td>Reasonably low</td><td>The performance can be improved by using more sophisticated kernels</td></tr></table>	Algorithms	Accuracy	Model Complexity	Treat with Uncertainties	Computational Time	Robustness	Observations	ANN	Reasonably high	Reasonable	Low	Reasonably low	Reasonably low	The performance can be improved with a large amount of accurate data	AE	High	Reasonably high	Reasonable	Reasonably low	Reasonable	Good generalisation properties	CNN	High	High	Reasonable	Reasonably high	Reasonable	-	ELM	Reasonably high	Reasonably low	Low	Low	Low	-	GAN	Low	High	Reasonably low	Reasonable	Reasonable	-	RNN	High	High	Reasonably low	Reasonable	Reasonably high	Large amount of and sequential data	Bayesian Models	High	Reasonable	Reasonably high	Reasonable	Reasonably high	-	Clustering	Reasonably high	Reasonable	Reasonable	Reasonably high	Reasonably high	The performance can be improved by having an accurate dataset	Decision Tree	High	Reasonable	Reasonable	Reasonably low	Reasonably high	-	Fuzzy Logic	High	Reasonably high	Reasonably high	Reasonably low	High	Generalisation properties with a reasonable amount of domain expertise in the field is needed	Genetic Programming	High	High	Reasonably low	High	High	-	L and NL Regression	Reasonable	Low	Low	Low	Reasonably low	Regularisation can help to generalise the solution	PCA	Low	Low	Reasonably low	Low	Low	It works well only with linear data. Good performance requires pre-processing data	SVM	Reasonably high	Reasonably low	Reasonable	Low	Reasonably low	The performance can be improved by using more sophisticated kernels
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Table: Comparative study of the presented machine-learning-based models.																																																																																																											

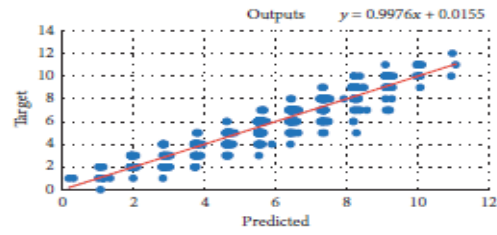


FIGURE 4: Correlation between predicted and target values of the dataset for LR.

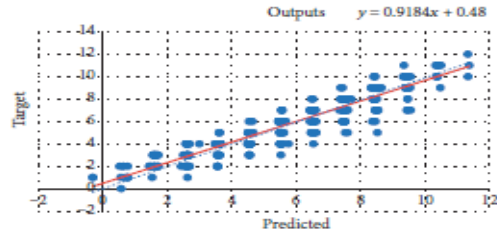


FIGURE 5: Correlation between predicted and target values of the dataset for SVR.

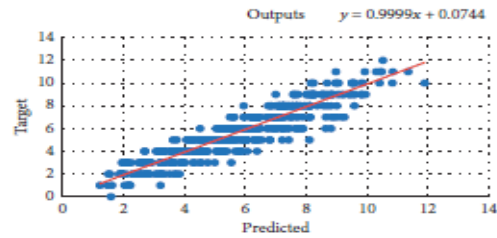


FIGURE 6: Correlation between predicted and target values of the dataset for MLP.

- The results indicate that the proposed hybrid data preparation model significantly improves the accurate prediction of failure counts.
- Comparing AE–CNN–BGRU with other similar deep learning methods, the proposed approach shows superior performance with 18% better precision, 5% in a recall, and 10% in g-mean. The results also indicate the model effectiveness in predicting component failure within a defined useful period that aids in minimising operational disruption.