Comparing Machine Learning Models for Malware Detection

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Introduction - Malware

- Ransomware and cybersecurity breaches are a growing threat to businesses.
- There is a growing need to detect and block malware as quickly as possible while minimizing false positives.
- Security companies are using machine learning to evaluate files and processes to determine if the files are malicious or not.

Introduction - Value

- Classifying malware as malicious or not is valuable to organizations because of cybersecurity threats.
- Coding value is found in comparing the algorithms. This allows an organization to pick an algorithm that completes the classification task.

Literature Review – Survey Papers

- Academic papers surveying malware detection with machine learning were valuable.
- The survey papers aimed to explain the basics of malware and detection. Academic papers presenting machine learning detection were shared.
- These papers provided information on how to implement malware detection using machine learning models.

Literature Review – ML Models

- Support Vector Model and Random Forest algorithms were researched during the literature review.
- Academic papers presented good results, >95% detection accuracy, using SVM and RF.
- The data imported in the models varied. PE Header data was researched and found to be a good dataset for detection.

Methodology – Planning

- Perform data processing and feature extraction.
- Write python code to run the machine learning models.
- Measure speed and accuracy of the models.

Methodology – Algorithms

 Support Vector Model – algorithm that splits linear or non-linear data points across n-dimensional planes. Good for high dimensional analysis. High compute requirements with large datasets, extremely slow.

 Random Forest – algorithm that uses multiple decision trees and averages the trees. This prevents overfitting. Extremely fast compared to SVM.

Implementation – Programming

- Use Python modules, Pandas and Numpy, to extract and process data and features.
- Use Sklearn modules to setup the learning models.
- Use the Python time module to measure speed of execution.
- The code runs in Google Colab. Allows for a standardization for hardware.

Implementation - Dataset

- Data will be standardized.
- Perform data cleaning, remove any null values.
- Use the train_test_split Sklearn module to prepare the dataset.

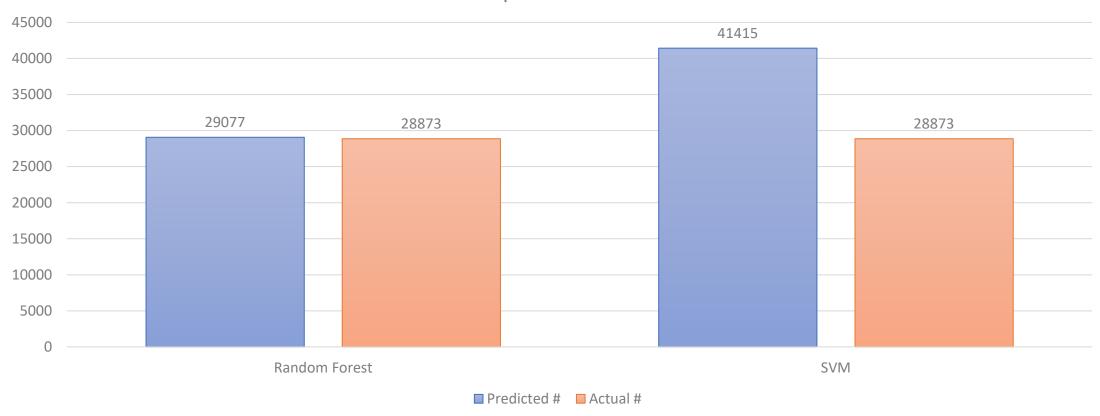
Experimental Setup – Metrics

- Use mean absolute error, and execution time to determine which model performs better.
- Validation dataset size is 10% of the dataset.

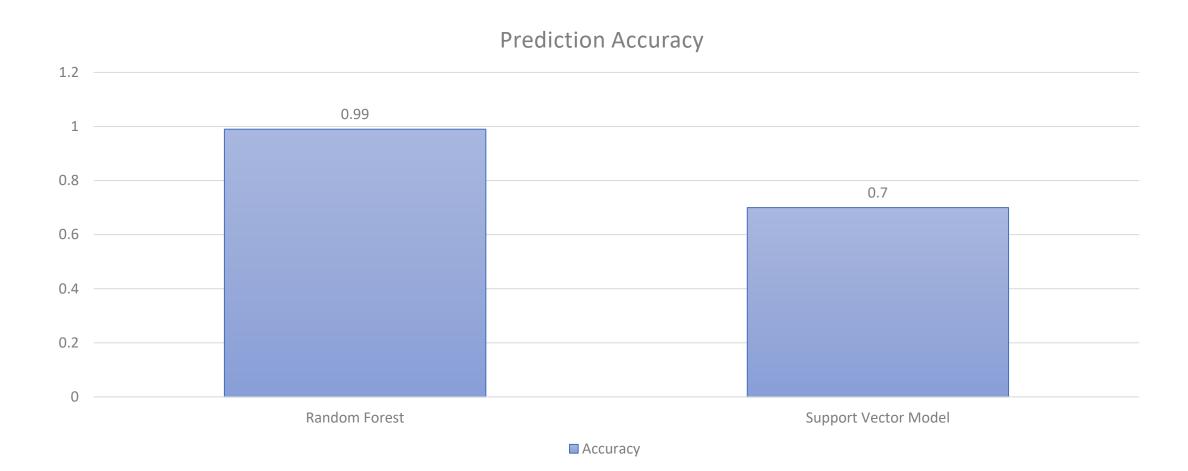
Demo

Initial Results Analysis – Prediction Count Comparison

Malware Samples Predicted vs Actual



Initial Results Analysis - Accuracy

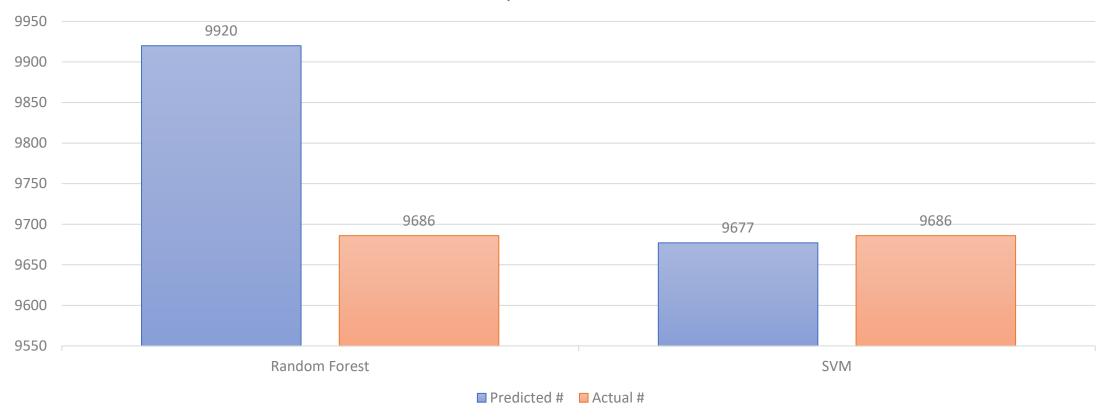


Testing Modifications

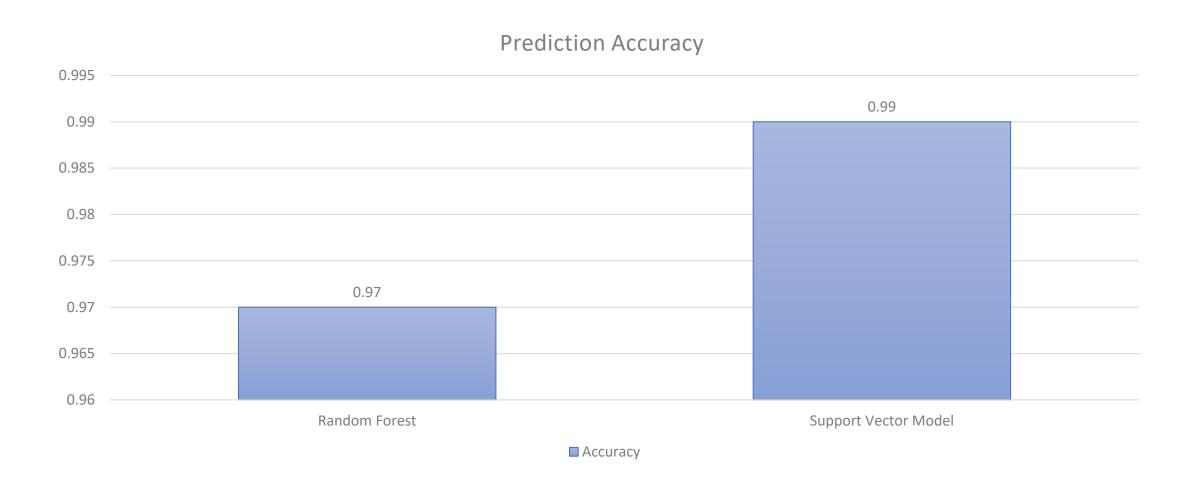
- Changed the test sample size from 25% to 10% of the dataset.
- Scaled the dataset using Sklearn module preprocessing.standardscaler.

Final Results Analysis - Prediction Count Comparison

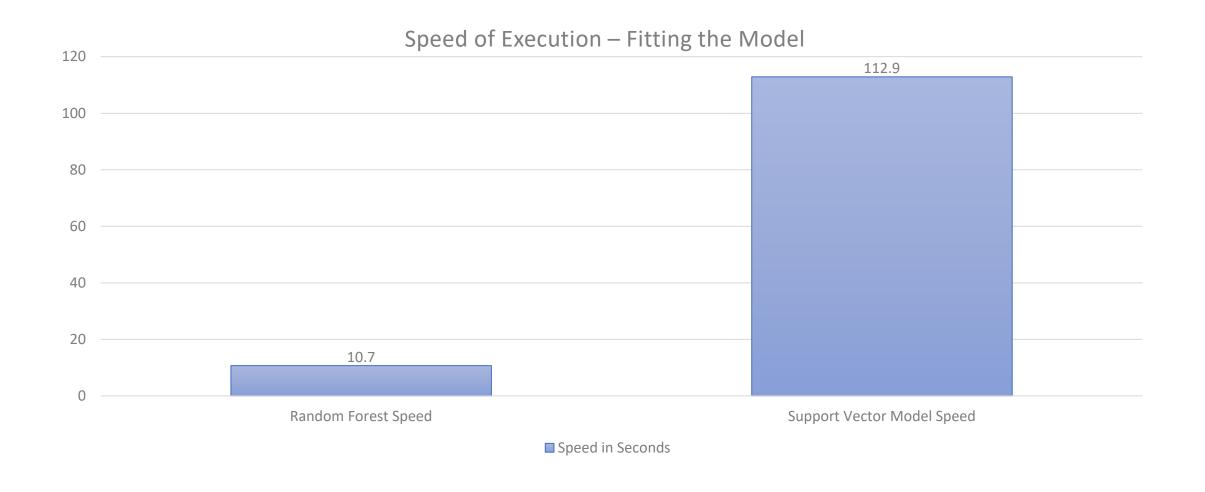
Malware Samples Predicted vs Actual



Final Results Analysis - Accuracy



Final Results Analysis - Speed



Conclusion

- Initial results showed that Random Forest was more accurate.
- After scaling the dataset, SVM had better accuracy.

References

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