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Anomaly detection in ICS datasets with machine learning algorithms

Mubarak S.^a, Habaebi M.H.^a✉, Islam M.R.^a, Rahman F.D.A., Tahir M.^b[📄 Save all to author list](#)^a International Islamic University Malaysia, Jalan Gombak, 53100, Malaysia^b Sunway University, Selangor, 47500, Malaysia[Abstract](#)[Author keywords](#)[Indexed keywords](#)[Topics of prominence](#)[Funding details](#)**Abstract**

An Intrusion Detection System (IDS) provides a front-line defense mechanism for the Industrial Control System (ICS) dedicated to keeping the process operations running continuously for 24 hours in a day and 7 days in a week. A well-known ICS is the Supervisory Control and Data Acquisition (SCADA) system. It supervises the physical process from sensor data and performs remote monitoring control and diagnostic functions in critical infrastructures. The ICS cyber threats are growing at an alarming rate on industrial automation applications. Detection techniques with machine learning algorithms on public datasets, suitable for intrusion detection of cyber-attacks in SCADA systems, as the first line of defense, have been detailed. The machine learning algorithms have been performed with labeled output for prediction classification. The activity traffic between ICS components is analyzed and packet inspection of the dataset is performed for the ICS network. The features of flow-based network traffic are extracted for behavior analysis with port-wise profiling based on the data baseline, and anomaly detection classification and prediction using machine learning algorithms are performed. © 2021 CRL Publishing. All rights reserved.

Author keywords

Anomaly detection; Industrial control system; Intrusion detection system; Machine learning; SCADA

Engineering controlled terms

Anomaly detection; Computer crime; Intrusion detection; Machine learning; Network security; SCADA systems

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Diagnostic functions; Flow-based network traffic; Industrial automation applications; Industrial control systems; Intrusion Detection Systems; Process operation; Remote monitoring; Supervisory control and data acquisition systems (SCADA)

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Prominence percentile

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