

Supplementary Material

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This document presents the full list of papers analyzed in this review, divided into three categories: 409 Categorized Papers (2019-2024), 12 Selected Reviews or Evaluation Papers (2019-2024) and 190 Validation Papers (2025). The 409 Categorized Papers (2019-2024) correspond to the categorized papers using the unified taxonomy. The 12 Selected Reviews or Evaluation Papers (2019-2024) comprise reviews papers as well as evaluation papers, which support the empirical development of the proposed taxonomy. The 190 Validation Papers (2025) is the set of papers retrieved from 2025 that were used to validate the taxonomy, confirming its relevance and adaptability to ongoing developments in the field.

409 Categorized Papers (2019-2024)

- [Cat1] Muhammad Abdan Mulia, Muhammad Bintang Bahy, Muhammad Zain Fawwaz Nuruddin Siswanto, Nur Rahmat Dwi Riyanto, Nella Rosa Sudianjaya, and Ary Mazharuddin Shiddiqi. 2024. KBJNet: Kinematic Bi-Joint Temporal Convolutional Network Attention for Anomaly Detection in Multivariate Time Series Data. *Data Sci. J.* 23, Article 10 (2024). doi:10.5334/dsj-2024-010
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- [Cat3] Ahmad Ahmad, Aleksandr Kovalenko, and Ilya Makarov. 2024. Anomaly Detection Using Graph-Based Autoencoder with Graph Structure Learning Layer. In *IEEE Int. Symp. Logist. Ind. Informat. (LINDI'24)*. 89–94. doi:10.1109/LINDI63813.2024.10820392
- [Cat4] Hamid Akbarian, Imadeldin Mahgoub, and Andre Williams. 2024. Autoencoder-K-Means Algorithm for Efficient Anomaly Detection to Improve Space Operations. In *IEEE Int. Conf. Smart Appl. Commun. Netw. (SmartNets'24)*. 1–6. doi:10.1109/SmartNets61466.2024.10577704
- [Cat5] Julien Audibert, Pietro Michiardi, Frédéric Guyard, Sébastien Marti, and Maria A. Zuluaga. 2020. USAD: UnSupervised Anomaly Detection on Multivariate Time Series. In *Proc. ACM SIGKDD Int. Conf. Knowl. Discov. Data Min. (KDD'20)*. 3395–3404. doi:10.1145/3394486.3403392
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- [Cat8] Md Abul Bashar and Richi Nayak. 2020. TAnoGAN: Time Series Anomaly Detection with Generative Adversarial Networks. In *IEEE Symp. Ser. Comput. Intell. (SSCI'20)*. 1778–1785. doi:10.1109/SSCI47803.2020.9308512
- [Cat9] Ali Behrouz, Michele Santacatterina, and Ramin Zabih. 2024. Chimera: Effectively Modeling Multivariate Time Series with 2-Dimensional State Space Models. In *Adv. Neural Inf. Process. Syst. (NeurIPS'24)*, Vol. 37. 119886–119918. doi:10.52202/079017-3810
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- [Cat11] David Campos, Tung Kieu, Chenjuan Guo, Feiteng Huang, Kai Zheng, Bin Yang, and Christian S. Jensen. 2021. Unsupervised time series outlier detection with diversity-driven convolutional ensembles. *Proc. VLDB Endow.* 15, 3 (2021), 611–623. doi:10.14778/3494124.3494142
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- [Cat16] Guillaume Chambaret, Laure Berti-Equille, Frédéric Bouchara, Emmanuel Bruno, Vincent Martin, and Fabien Chaillan. 2022. Stochastic Pairing for Contrastive Anomaly Detection on Time Series. In *Pattern Recognit. Artif. Intell. (ICPRAI'22) (LNCS, Vol. 13364)*. 306–317. doi:10.1007/978-3-031-09282-4_26
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- [Cat21] Ningjiang Chen, Huan Tu, Xiaoyan Duan, Liangqing Hu, and Chengxiang Guo. 2022. Semisupervised anomaly detection of multivariate time series based on a variational autoencoder. *Appl. Intell.* 53 (2022), 6074–6098. doi:10.1007/s10489-022-03829-1
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- [Cat36] Lucas Correia, Jan-Christoph Goos, Philipp Klein, Thomas Bäck, and Anna Kononova. 2023. MA-VAE: Multi-Head Attention-Based Variational Autoencoder Approach for Anomaly Detection in Multivariate Time-Series Applied to Automotive Endurance Powertrain Testing. In *Proc. Int. Jt. Conf. Comput. Intell. (NCTA'23)*. 407–418. doi:10.5220/0012163100003595
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