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Optimizing Deep Learning Inference Metrics For Multivariate Time Series

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2024

DOI (link to publisher)
[10.5463/thesis.759](https://doi.org/10.5463/thesis.759)

document version
Publisher's PDF, also known as Version of record

[Link to publication in VU Research Portal](#)

citation for published version (APA)

Pantiskas, L. (2024). *Optimizing Deep Learning Inference Metrics For Multivariate Time Series*. [PhD-Thesis - Research and graduation internal, Vrije Universiteit Amsterdam]. <https://doi.org/10.5463/thesis.759>

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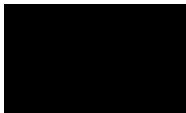
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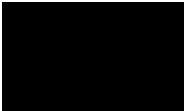


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