DOI: xxx/xxxx

ARTICLE TYPE

Identifying Birds through Sound: Challenges and Advances in **Machine Learning based Methods**

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Abstract

Better monitoring of animal populations is vital to understanding, mitigating, and reversing the global biodiversity crisis. Passive Acoustic Monitoring can potentially solve many of the logistical and resource limitations of widespread biological monitoring. However, accurate and scalable machine learning species classifiers are needed to process the vast amounts of data produced. Birds are widely recognised as important indicators of biodiversity, and this article provides a concise overview of cutting-edge deep learning methods for acoustic bird detection. We emphasise the importance and complexity of automating bird call detection and classification and cover key aspects such as data acquisition, signal pre-processing, audio feature representation, and advanced neural network architectures, showcasing the evolution and effectiveness of these techniques for bird recognition. We also highlight current research trends and suggest directions for advancing this rapidly growing field to enhance avian monitoring.

KEYWORDS

Bird sound classification, Bioacoustics, Deep learning, Convolutional neural networks

CONFLICT OF INTEREST

The authors declare no conflict of interest.

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ing).

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ACKNOWLEDGMENTS

This work was supported by funding from the European Union's Horizon Europe research and innovation programme under grant agreement No. 101081964.

Abbreviations: CNN, Convolutional neural network; PCEN, Per-Channel energy normalization; HMM, Hidden markov model.

Journal 2023;00:1-1 wileyonlinelibrary.com/journal/ © 2023 Copyright Holder Name

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