

convolutional recurrent neural network (C-RNN). This integrated architecture can learn and classify the entire hand gesture image sequence. Leveraging both architectures can potentially achieve even higher accuracy for in-air hand gesture signature recognition.

ACKNOWLEDGMENT

We acknowledge the Ministry of Higher Education (MOHE) for funding under the Fundamental Research Grant Scheme (FRGS) (FRGS/1/2021/ICT02/MMU/03/3).

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