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Loop Detection and Drift Error Minimization in Autonomous Vehicle by Utilizing Deep Learning and SLAM Method
Anak Agung Ngurah Bagus Dwimantara, Oskar Natan, S.ST., M.Tr.T., Ph.D; Dr. Andi Dharmawan, S.Si, M.Cs.
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