novel DNN architecture and loss function designs to obtain a single robust network that can work under various configurations. Simulation results demonstrate the good performance, low complexity, and strong robustness of the proposed algorithm. In the future, we will apply the proposed algorithm to more wireless communications problems and prove the convergence property to improve its universality and reliability.

Contributors

Jiabao GAO performed the simulations and drafted the paper. Xiaoming CHEN and Geoffrey Ye LI helped organize, revise, and finalize the paper.

Compliance with ethics guidelines

Xiaoming CHEN is a corresponding expert of Frontiers of Information Technology & Electronic Engineering. Jiabao GAO, Xiaoming CHEN, and Geoffrey Ye LI declare that they have no conflict of interest.

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