A compass towards equity: a data analysis framework to capture children's behaviour in the playground context

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Maedeh Nasri was born in Ramsar, Iran, in 1994. She finished high school in mathematics and physics in Farzanegan, National Organization for Development of Exceptional Talents. In 2012, she started her B.Sc. in the Electrical Engineering department at the Polytechnic of Tehran, Iran. After completing the bachelor program in 2016, she was admitted as an exceptionally talented student to the M.Sc. study in Electrical Engineering—control systems with exemption from the M.Sc. entrance exam at the same university. She finished her M.Sc. in Electrical Engineering under the supervision of Prof. H.A. Talebi and Dr. M.A. Khosravi.

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