

# **Structured parallel programming for Monte Carlo Tree Search** Mirsoleimani, S.A.

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# Curriculum Vitae

Sayyed Ali Mirsoleimani was born in Abadeh, Iran, on May 28, 1986. He obtained his bachelor degree in Computer Software Engineering at the Islamic Azad University in Najafabad, Iran. In 2013, he continued with a Master in Software Engineering at the Shiraz University in Shiraz, Iran. His Master's thesis was titled "Proposing and Evaluation of a Performance Prediction Model for Graphics Processing Units".

Immediately thereafter, Ali started to work in an ERC Advanced Grant funded Ph.D. project at the Tilburg University under supervision of Professor Jaap van den Herik and Professor Aske Plaat and at Nikhef in Amsterdam under supervision of Dr. Jos Vermaseren (the PI of the project). In April 2014, he accompanied his supervisors to the Leiden University. He defended his Ph.D thesis in 2020.

Currently, Ali is working at ASML, the world's leading manufacturer of lithography machines, in Eindhoven. Ali is mainly responsible for developing calibration models to contribute to realizing Moore's Law.

# **Publications**

- S. A. Mirsoleimani, A. Plaat, J. Vermaseren, and H. J. van den Herik, Performance analysis of a 240 thread tournament level MCTS Go program on the Intel Xeon Phi, in Proceedings of the 2014 European Simulation and Modeling Conference (ESM 2014), 2014, pp. 88--94.
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