

Genetic Programming on Graphics Processing Units Bibliography

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1 Overview

The use of Graphics Processing Units (GPUs) in scientific computing is becoming increasingly common. GPUs are low cost parallel processors that can readily be exploited for many types of general purpose computation. Recently, the computational intelligence community has started to develop for the GPU platform.

The papers listed here are primarily about the use of GPUs as a platform for Genetic Programming. However, I have also included other related papers that may be of interest to the community.

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