University of Pisa

Department of Computer Science

Parallel And Distributed Systems: Paradigms And Models

Course Project 2 - A.A. 2024/25

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Distributed Parallel Random Forest

A Scalable Implementation for Classification Tasks

Implementation Variants:

- Single-node Shared-memory (FastFlow & OpenMP)
- Multi-node Hybrid (MPI + FastFlow)
- Performance Evaluation & Scalability Analysis

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Abstract

This report presents the design and implementation of a distributed parallel Random Forest algorithm for large-scale classification tasks. The project delivers three distinct implementations: single-node shared-memory versions using FastFlow and OpenMP frameworks, and a multi-node hybrid version combining MPI with either FastFlow or OpenMP. The implementations are validated against scikit-learn on datasets from the UCI Machine Learning Repository, including SUSY, Covertype, and Iris datasets. Performance evaluation encompasses systematic analysis of scalability across varying numbers of decision trees, dataset characteristics, and computational resources. The study demonstrates efficient parallel algorithms achieving significant speedup while maintaining classification accuracy, with comprehensive analysis of strong and weak scalability up to 8 compute nodes. Key contributions include optimized load balancing strategies, minimized communication overhead, and detailed cost model development for distributed Random Forest implementations.

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1 Introduction

Authors:

- Alice Rossi -
- Bob Bianchi -
- Carla Verdi -
- David Neri -
- Eva Gallo -

2 Validation

I decided to use this Random Forest implementation because it is a pure implementation of Random Forests as described in: Leo Breiman. Random Forests. Machine Learning 45(1):5-32, 2001. The implementation is written in C++ and can be found inside the include folder of the project. I had to make some changes to the code because during the validation process, I found that it had some bugs.

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