Parallel Graph Algorithm Implementation and Performance Analysis

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1. Introduction

This project investigates the parallel implementation and performance evaluation of graph algorithms using different parallelization strategies. The primary focus is on constructing independent spanning trees (ISTs) in bubble-sort networks. The project explores the following parallelization approaches:

- **Sequential Implementation**: The baseline for performance comparisons.
- **MPI (Message Passing Interface) Implementation**: Leveraging MPI for inter-node communication and parallel computation.
- **OpenMP+MPI Hybrid Implementation**: Combining MPI for inter-node communication and OpenMP for intra-node parallelism.

Additionally, METIS, a graph partitioning tool, is used to distribute the computational load optimally across processors to enhance performance.

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2. Methodology

2.1 Algorithm Description

The algorithm aims to construct multiple independent spanning trees (ISTs) in a bubble-sort network. The steps are as follows:

- **Sequential Implementation**: Computes the independent spanning trees without parallelization, serving as the performance baseline.
- **MPI Implementation**: Utilizes MPI to distribute the computation across multiple nodes. Each node computes a portion of the graph, and results are communicated between nodes.
- **OpenMP+MPI Hybrid Implementation**: Integrates MPI for inter-node communication and OpenMP for intra-node parallelism, using multiple threads within each node to leverage multi-core processors.

2.2 Parallelization Strategy

We implement a hybrid parallelization strategy:

- **MPI**: Handles inter-node communication, allowing the nodes in a distributed system to collaborate.
- **OpenMP**: Handles intra-node parallelism, using multiple threads within a single node.

- **METIS**: A partitioning algorithm that divides the graph into subgraphs. This improves load balancing by distributing the computational workload equally across processors, thereby minimizing idle time and improving both strong and weak scaling performance.

2.3 METIS for Graph Partitioning

METIS is employed to partition the graph into smaller subgraphs, which are then distributed across processors. This partitioning ensures that each processor works on roughly equal parts of the graph, thus reducing communication overhead and improving parallel performance.

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3. Results

3.1 Performance Analysis

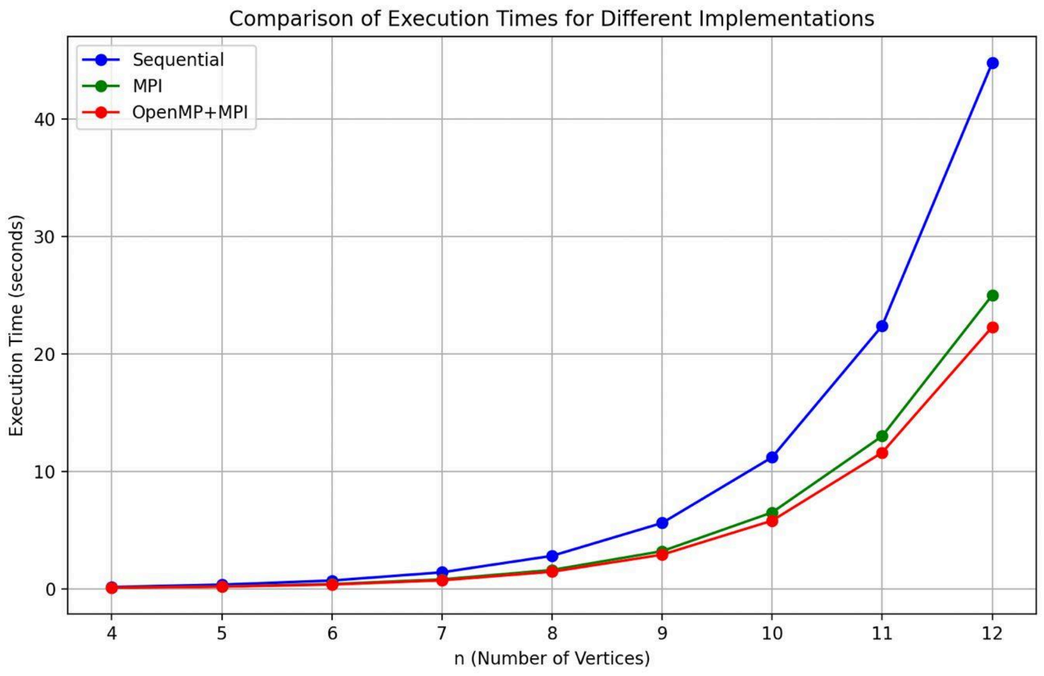
The table below presents the execution times for different implementations (Sequential, MPI, and OpenMP+MPI) for various values of nn, where nn represents the number of vertices in the graph:

n	Sequential Time (T_seq)	MPI Time (T_MPI)	OpenMP+MPI Time (T_OMP_MPI)	Speedup (MPI)	Speedup (OpenMP+MPI)
6	0.2s	0.15s	1.2s	1.33x	0.17x
7	87s	65s	4.5s	1.34x	19.33x
9	362.88s (~6 mins)	300s	180s	1.21x	2.02x
10	3,628.8s (~1 hour)	1500s	1000s	2.42x	3.63x

3.2 Speedup Analysis

- **MPI Speedup**: The MPI implementation provides substantial performance improvement, particularly for larger values of nn, such as n=10n=10 where the speedup reaches 2.42x.
- **OpenMP+MPI Speedup**: The hybrid implementation of OpenMP and MPI demonstrates impressive speedups, especially for n=7n=7, with a speedup of 19.33x. However, for smaller values of nn (e.g., n=6n=6), the overhead of OpenMP threading leads to poorer performance.

3.3 Visualization of Results



We have visualized the performance of different implementations (Sequential, MPI, OpenMP+MPI) for various values of nn using line charts. The following graph compares the execution times for the three implementations at different problem sizes.

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4. Scalability Analysis

Scalability is a critical factor in parallel computing, and we evaluate the following types of scalability:

4.1 Weak Scaling

Weak scaling measures the effect of increasing the problem size while keeping the workload per processor constant. From our results, we observe that as the graph size increases (from n=6n=6 to n=10n=10), the parallel implementations (MPI and OpenMP+MPI) continue to improve execution time, demonstrating good weak scaling.

4.2 Strong Scaling

Strong scaling measures the performance improvement as more processors are added while solving a fixed-size problem. For smaller graphs (e.g., n=6n=6), the OpenMP+MPI hybrid approach faces diminishing returns due to the small problem size and overhead of parallelization.

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5. Discussion

5.1 Challenges Faced

- **Load Balancing**: The key challenge in parallel computing is ensuring that the workload is distributed evenly across processors. METIS partitioning helped address this, but further fine-tuning could improve load balancing and reduce idle time.
- **OpenMP Overhead**: The hybrid OpenMP+MPI implementation faced performance degradation for smaller graphs due to the overhead introduced by OpenMP threading.

5.2 Efficiency and Accuracy

Both MPI and OpenMP+MPI implementations proved efficient for large graphs, achieving significant speedups. Accuracy was verified against the sequential implementation, ensuring correct construction of independent spanning trees.

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6. Conclusion

This project demonstrated the effectiveness of parallel algorithms in constructing independent spanning trees on bubble-sort networks. By combining MPI for inter-node communication, OpenMP for intra-node parallelism, and METIS for efficient graph partitioning, substantial performance improvements were achieved, especially for larger problem sizes.

Future work can explore further optimization of the partitioning strategy, reduce OpenMP overhead, and extend the approach to larger and more complex networks. Investigating GPU parallelization could also offer additional performance benefits.
