## **Minimum Spanning Trees**

**Submitted By** 

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# **Minimum Spanning Trees**

A minimum spanning tree (MST) is a fundamental concept in graph theory. Given a connected, undirected graph with weighted edges, a spanning tree is a subgraph that is a tree and connects all the vertices together without creating any cycles. A minimum spanning tree of a graph is a spanning tree with the smallest possible sum of edge weights. The maximum of edges in a MST will be equal to number of vertex V - 1

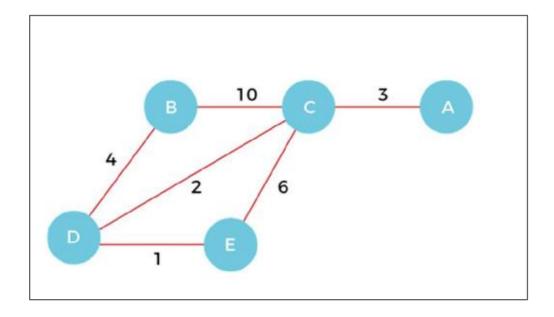
Maximum Edges in MST = V - 1

## Prim's algorithm

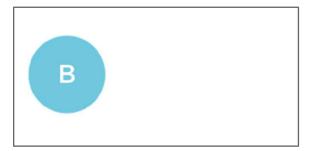
It falls under the umbrella of algorithms called greedy algorithms that find the local optimum solution in the hope of finding global maxima.

### Working:

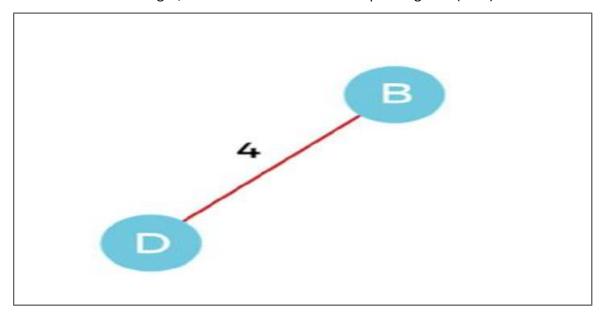
Let us discuss the working of the algorithm through an example. Let's consider the below graph.



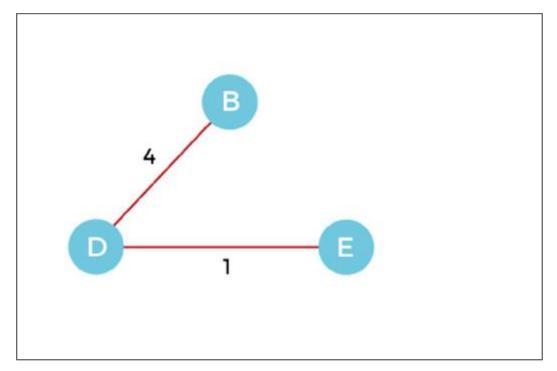
**Step 1**: Start by selecting a vertex from the given graph. For instance, let's pick vertex B.



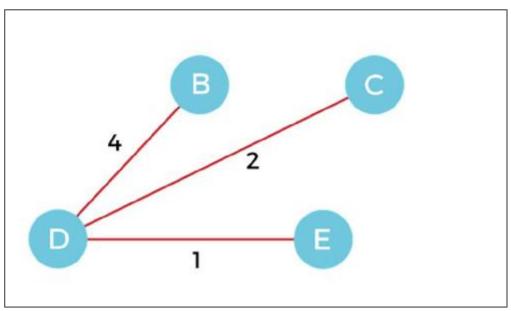
**Step 2:** Next, select and include the shortest edge connected to vertex B. Vertex B has two adjacent vertices, C and D, with edges of weights 10 and 4 respectively. Choose the edge BD, as it has the smallest weight, and add it to the minimum spanning tree (MST).



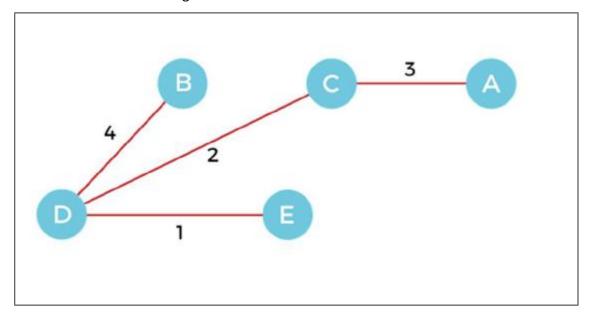
**Step 3:** Continuing, identify the edge with the smallest weight among the remaining edges. Here, we edge DE and DC and BC with a weight of 1,2,10 respectively. We picked the edge DE since it's the minimum and does not form a circle.



**Step 4:** Next, we edge EC, DC, and BC with a weight of 6, 2,10 respectively. We choose the edge DC as it's the minimum among the given options and does not form a circle.



**Step 5:** Next, we edge EC,CA and BC with a weight 6, 3,10 respectively. We picked the edge CA as it's the minimum among these and does not form a circle.



The cost of the minimum spanning tree is the Sum of Weight of the Edges which is given the sum of edge DB, DE, DC, CA (4, 1, 2, 3 = 10).

## Algorithm:

**Step 1:** Initialize the minimum spanning tree with a vertex chosen at random.

**Step 2:** Find all the edges that connect the tree to new vertices, find the minimum and add it to the tree if it is not forming the circle.

**Step 3:** Keep repeating step 2 until we get a minimum spanning tree.

#### **Data Structure Used**

- Array Graph Representation of a Weight Graph.
- Array MST for keeping track of vertices.
- Array of boolean for keeping record of visited vertices.

### **Parallel Implementation Details:**

Partition the input set V into p subsets, such that each subset contains n/p consecutive
vertices and their edges, and assign each process a different subset. Each process also
contains part of array d for vertices in its partition.

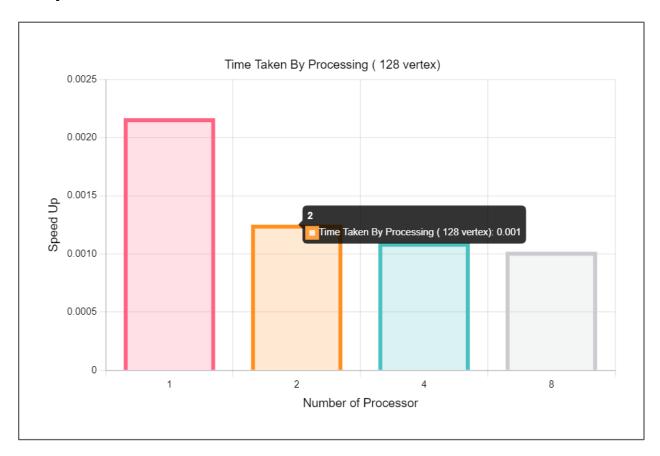
- 2. Let Vi be the subset assigned to process pi, and di part of array d which pi maintains. Every process pi finds a minimum-weight edge ei (candidate) connecting MST with a vertex in Vi.
- 3. Every process pi sends its ei edge to the root process using all-to-one reduction.
- 4. From the received edges, the root process selects one with a minimum weight (called global minimum-weight edge minimum), adds it to MST and broadcasts it to all other processes.
- 5. Processes mark vertices connected by minimum as belonging to MST and update their part of array d.
- 6. Repeat steps 2-5 until every vertex is in M.

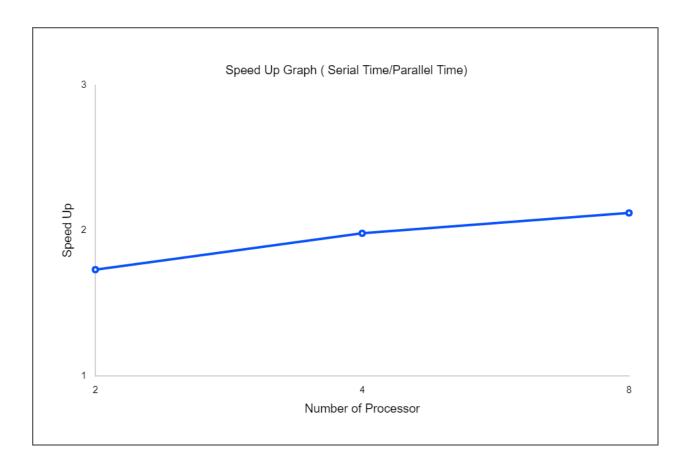
## **Performance Calculation & Graph:**

In this case, Number of vertices of the graph is constant at 128.

Number Of Processor	Time Time	Speed Up(Serial time/ Parallel time)
1	0.002167	-(Serial Time)
2	0.001253	1.73
4	0.001097	1.98
8	0.001020	2.12

## Graph:



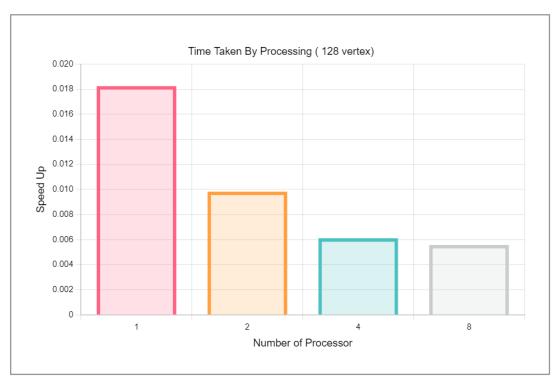


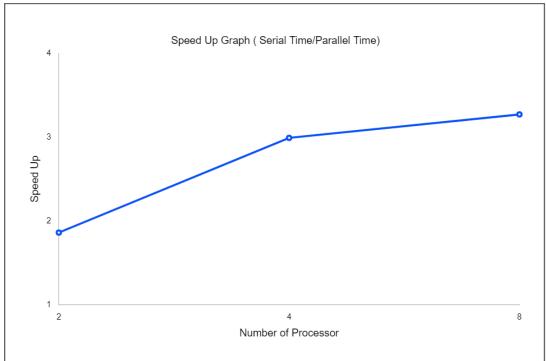
## **Performance Calculation & Graph:**

**Increasing the Number of Vertices = 256.** 

Number Of Processor	Time Time	Speed Up(Parallel time/ serial time)
1	0.018251	-(Serial Time)
2	0.009830	1.86
3	0.006106	2.99
4	0.005575	3.27

## Graph:



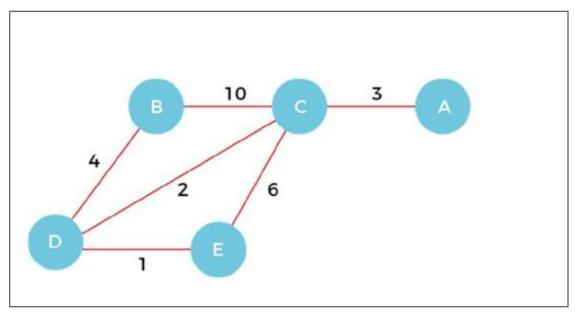


## Kruskal's Algorithm

It also falls under the umbrella of algorithms called greedy algorithms that find the local optimum solution in the hope of finding global maxima.

## Working:

Let us discuss the working of the algorithm through an example. Let's consider the below graph.

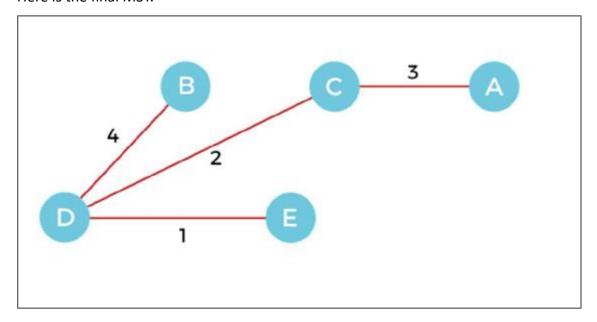


**Step 1:** We first Sort all the edges of the graph into a list in terms of increasing weight value. Here are the Edges after the sorting.

**Step 2:** We start picking the edges from the sorting list and add them in case they are already not in MST. We first pick the edge DE and check that it's not in MST and add it.

- Step 3: Next We pict DC and add it to the MST.
- Step 4: Next We pict CA and add it to the MST.
- **Step 5:** Next we BD and add it to the MST.

**Step 6:** Since, We reached the maximum edges in MST( 5-1 = 4 edges), We end the loop here. Here is the final MST.



## Algorithm:

- **Step 1:** Arrange all edges in ascending order of their weights.
- **Step 2:** Select the smallest edge.
- **Step 3:** Verify if adding this edge would create a cycle with the existing spanning tree. If not, incorporate it into the tree. Otherwise, disregard it.
- **Step 4:** Repeat step 2 until the end of vertexes or maximum vertices are found for MST.

#### **Data Structure Used**

- Aray Graph Representation of a Weight Graph.
- Array of Edges.
- Merge Sort Algorithm
- Union Algorithm for finding cycle in a non-connected graph.

#### **Parallel Implementation:**

**Step 1:** Since the heart of the algorithm is sorting. So, We sort all the vertices in parallel in terms of increasing weight. First, we divide the edges among processors. Here let's say we have 8 vertices and 2 processors. We divide 8/2 = 4 edges among each processor.

- Each process will then sort its edges separately using merge sort.
- After the sort, Each process sends the sorted edge to root, Root will combine the edges to global sorted array.

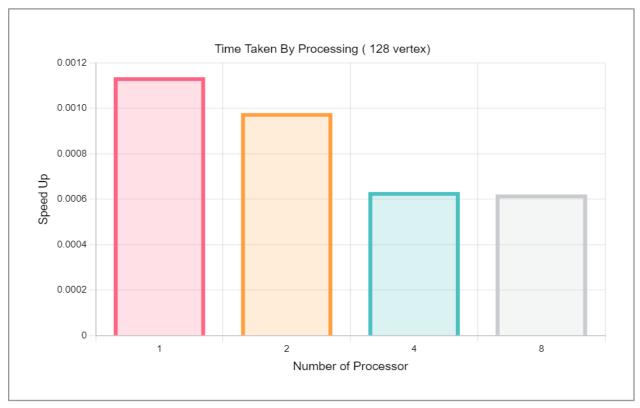
**Step 2:** Root will simply iterate over the sorted array in O(N) alteration to find the MST. In each iteration following steps are performed.

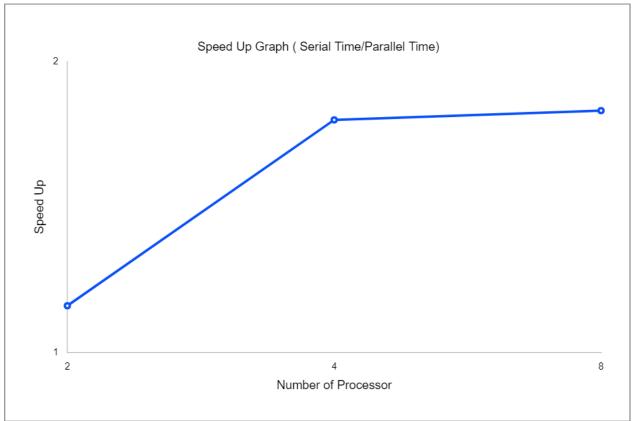
- It picks an edge, will first check if it forms the circle or not using the union algorithm, if the edge does not form a circle and is not in MST, then it's added.
- The step is repeated until we reach the maximum edges in MST or the all the edges are checked.

### **Performance Calculation & Graph:**

Number Of Processor	Time Time	Speed Up(Serial time/ Parallel time)
1	0.001137	-(Serial Time)
2	0.000980	1.16
4	0.000632	1.80
8	0.000621	1.83

## Graph:





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### **Parallel Time Complexities:**

- n represents the total amount of data (vertices or edges).
- m represents the total number of edges.
- p represents the number of processors.

Algorithm	Operation	Time Complexity
Prim's Algorithm	Scattering Data	O(n/p)
	Minimum Edge Calculation	O(n/p)
	Allreduce & Broadcast	$O(\log p)$
	Overall Complexity	$O(n/p) + O(\log p)$
Kruskal's Algorithm	Scattering Data	O(m/p)
	Sorting Edges	$O(n\log(n/p))$
	Merging Sorted Lists	$O(\log p)$
	Overall Complexity	$O(m/p) + O(n\log(n/p)) + O(\log p)$

### Algorithm 1:

```
// command to compile: mpicc -o algol algo2.c
// command to run: mpirun -np <numberProcs> algol
#include <mpi.h>
#include <stdio.h>
#include <stdio.h>
#include <math.h>
#include #include
```

```
for (int k = 0; k < mSize - 1; ++k)
MPI COMM WORLD);
```

```
free (MST);
```

```
{
    matrix[mSize * i ] = 0;
    for (int j = i + 1; j < mSize; ++j)
    {
        matrix[mSize * i + j] = matrix[mSize * i + j] = rand() % 10;
    }
}

// after this each processor needs its own chunk of data
MatrixChunk = (int *)malloc(sendcounts * mSize * sizeof(int));
// here the chunk each processor needs will be scatter to it
MPI_Scatter(matrix, sendcounts*mSize, MPI_INT, MatrixChunk,
sendcounts*mSize, MPI_INT, 0, MPI_COMM_WORLD);
    primAlgorithm(rank, sendcounts, size);
    free(MatrixChunk);
    MPI_Finalize();
    return 0;
}</pre>
```

### **Result of Algorithm 1:**

```
Number of processors: 8
Number of vertices: 128
Time of execution: 0.001206
The minimun Weight is 154
Edge 1 0
Edge 2 1
Edge 3 0
Edge 5 0
Edge 6 5
Edge 7 4
Edge 8 0
Edge 9 6
Edge 10 0
Edge 11 0
Edge 11 1
Edge 11 1
Edge 13 11
Edge 14 12
Edge 15 10
Edge 15 10
Edge 16 1
Edge 17 8
Edge 18 11
Edge 18 11
Edge 18 11
Edge 18 12
Edge 19 0
Edge 20 8
Edge 21 0
Edge 22 1
Edge 23 20
Edge 24 23
Edge 25 10
Edge 27 0
Edge 27 0
Edge 28 27
Edge 28 27
Edge 29 26
Edge 27 0
Edge 28 27
Edge 29 26
Edge 30 8
Edge 21 0
Edge 27 0
Edge 28 27
Edge 29 26
Edge 30 8
Edge 27 0
Edge 28 27
Edge 38 8
Edge 38 21
Edge 39 0
Edge 30 8
Edge 31 8
Edge 32 12
Edge 33 8
Edge 34 21
Edge 36 20
Edge 37 21
Edge 39 0
Edge 44 24
Edge 45 30
Edge 47 22
Edge 48 28
Edge 49 35
Edge 40 39
Edge 47 22
Edge 48 28
Edge 47 22
Edge 48 28
Edge 49 35
Edge 50 39
Edge 51 26
Edge 50 39
Edge 51 26
Edge 60 15
Edge 50 39
Edge 51 26
Edge 61 35
Edge 63 25
Edge 64 15
Edge 65 35
Edge 67 10
Edge 67 10
Edge 77 56
Edge 67 10
Edge 77 56
Edge 67 10
Edge 77 56
Edge 80 22
Edge 81 37
Edge 77 56
Edge 87 10
Edge 88 22
Edge 88 27
Edge 88 27
Edge 88 27
Edge 88 27
Edge 87 10
Edge 88 22
Edge 88 27
Edge 88 26
Edge 87 10
Edge 88 22
Edge 88 27
Edge 88 28
Edge 89 25
Edge 89 27
Edge 99 47
Edge 89 27
Edge 99 47
Edge 89 27
Edge 99 47
Edge 99 42
```

```
Edge 93 29
Edge 94 25
Edge 95 42
Edge 96 22
Edge 97 26
Edge 98 38
Edge 99 26
Edge 100 10
Edge 101 22
Edge 102 49
Edge 103 35
Edge 104 37
Edge 105 43
Edge 106 0
Edge 107 29
Edge 108 22
Edge 109 58
Edge 110 15
Edge 111 43
Edge 112 10
Edge 113 0
Edge 114 15
Edge 115 46
Edge 116 0
Edge 117 25
Edge 118 21
Edge 119 41
Edge 120 21
Edge 121 61
Edge 122 10
Edge 123 0
Edge 124 32
Edge 125 29
Edge 126 0
Edge 127 0
```

#### Algorithm 2:

```
void readDataOfGraphFromFile(Graph *graph, const char inputFileName[])
  if (inputFile == NULL)
```

```
fscanfResult = fscanf(inputFile, "%d %d %d", &from, &to, &weight);
 fclose(inputFile);
 memset(set->canonicalElements, ELEMENT UNSET, elements * sizeof(int));
int FindSet(const Set *set, const int vertex)
    set->canonicalElements[vertex] = FindSet(set, set-
```

```
void unionSet(Set *set, const int parent1, const int parent2)
  if (root1 == root2)
void copyEdge(int *To, int *From)
void merge(int *edgeList, const int start, const int end, const int pivot)
     copyEdge(&working[(workingEnd - i) * 3], &edgeList[i * 3]);
     if (working[right * 3 + 2] < working[left * 3 + 2])</pre>
```

```
copyEdge(&edgeList[k * 3], &working[left * 3]);
roid mergeSort(int *edgeList, const int start, const int end)
        MPI Finalize();
```

```
mergeSort(edgeListDivided, 0, elementsPart - 1);
   if (parallel)
               merge(edgeListDivided, 0, elementsPart + elementsRecieved - 1,
elementsPart - 1);
               elementsPart += elementsRecieved;
         else if (rank % step == 0)
void kruskalAlgorithm(Graph *graph, Graph *mst)
```

```
MPI Comm rank (MPI COMM WORLD, &rank);
      if (ElementFrom != ElementTo)
         copyEdge(&mst->edgeList[edgesMST * 3], &graph-
free(set->canonicalElements);
Graph *graph = &(Graph) {.edges = 0, .vertices = 0, .edgeList = NULL};
```

```
Graph *MST = & (Graph) {.edges = 0, .vertices = 0, .edgeList = NULL};
if (rank == 0)
{
    // read the graph from the file
    readDataOfGraphFromFile(graph, argv[1]);
    newGraph(MST, graph->vertices, graph->vertices - 1);
}

double start = MPI Wtime();
    // use Kruskal's algorithm
    kruskalAlgorithm(graph, MST);
    if (rank == 0)
{
        printf("Time elapsed: %f s\n", MPI_Wtime() - start);
        // print the edges of the MST
        printf("Minimum Spanning Tree (Kruskal):\n");
        unsigned long weightMST = 0;
        for (int i = 0; i < MST->edges; i++)
        {
            weightMST += MST->edgeList[i * 3 + 2];
        }
        printf("MST weight: %lu\n", weightMST);
        printGraph(MST);
        // cleanup memory
        free(graph->edgeList);
        free(MST->edgeList);
        free(MST->edgeList);
        free(MST->edgeList);
        free(mst->edgeList);
        free(mst->edgeList);
        return 0;
    }
}
```

#### **Result of Algorithm 2:**

```
[[annatshi@csremote1 final]$ mpirun -np 4 ./algorithm2 testgraph.txt
Time elapsed: 0.000074 s
Minimum Spanning Tree (Kruskal):
MST weight: 18
0
     1
          1
1
     4
          2
0
     5
          3
0
     3
          5
1
          7
```

```
12
12
12
12
13
13
          14
                   11111111111111111
          19
          28
          77
          52
          63
13
          75
13
14
14
14
15
16
          99
          57
          70
          117
          79
          36
          76
16
          93
16
17
18
18
19
19
20
21
21
24
26
28
29
35
          94
          101
          59
                    1
          65
          22
          38
          44
          66
          54
          34
                   1
1
1
1
1
          84
          46
          51
          48
          80
          125
          61
                    1
36
          83
                    1
41
42
43
          119
                    1
          92
                    1
          105
                    1
43
          111
                    1
```

#### **Future Work:**

Currently, The algorithm is not working When the division of vertex is not uniform. In other words, When vertexes % Processes != 0, In that case the scatter function will not work, We need to improve the algorithm to support that.

#### **Further Notes:**

The communication overhead becomes quite significant with a large number of processors with small verteces, As in that case serial would do a better job on small graphs as compared to using n number of processors.

#### Conclusion:

To conclude, Minimum Spanning Tree (MST) algorithms like Prim's and Kruskal's play a pivotal role in network design, including applications such as network traffic minimization, the design of efficient routing protocols, and infrastructure development. Both algorithms are examples of greedy techniques used to find globally optimal solutions by making a sequence of locally optimal choices.

Prim's algorithm is efficient in scenarios where the graph has a dense adjacency matrix, as it incrementally builds the MST by adding the cheapest edge that expands the tree. On the other hand, Kruskal's algorithm is generally more efficient for sparse graphs, as it builds the MST by sorting all the edges first and then selecting the smallest edges that do not form a cycle. The parallel implementations of these algorithms demonstrate significant improvements in computational efficiency, which is particularly notable as the size of the graph increases. This makes parallel computing a valuable approach for dealing with large-scale problems in real-time applications. However, the efficiency gains from parallelization must be carefully weighed against the overhead of process communication, especially when dealing with smaller graphs or a large number of processors.

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