

TRAVELING SALESMAN PROBLEM IN DISTRIBUTED ENVIRONMENT

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ABSTRACT

In this paper, we focus on developing parallel algorithms for solving the traveling salesman problem (TSP) based on Nicos Christofides algorithm released in 1976. The parallel algorithm is built in the distributed environment with multi-processors (Master-Slave). The algorithm is installed on the computer cluster system of National University of Education in Hanoi, Vietnam (ccs1.hnue.edu.vn) and uses the library PJ (Parallel Java). The results are evaluated and compared with other works.

KEYWORDS

TSP, processor, parallel, distributed, cycle

1. INTRODUCTION

Traveling salesman problem (TSP) is a well known problem. The problem is solved in different ways. Especially in 1976, Nicos Christofides introduced new algorithms called Christofides' algorithm [3]. In 2003, Ignatios Vakalis built Christofides' algorithms on MPI environment [4]. In this paper, we build Christofides' traveling salesman problem in distributed environment. Sequential algorithms are built thoroughly with illustrative examples. In addition, parallel algorithms are experimented in different graphs.

2. CHRISTOFIDES' TRAVELING SALESMAN PROBLEM ALGORITHM

Let $G=(V,E)$ be a graph and let $P=V_1, V_2, \dots, V_k$ be a path in G . This path is called a Hamiltonian path if and only if P is containing every vertex in V . P is a Hamiltonian cycle if and only if $V_1=V_k$ and P is a Hamiltonian path. Where G is a directed graph, the terms directed Hamiltonian path and directed Hamiltonian cycle are used. The problem of determining a shortest directed in a weighted directed graph G is called the Traveling Salesman Problem (TSP) [1].

Consider an $n \times n$ distance matrix D with positive entries; for example, the distance between the cities the traveling salesman is visiting. We assume D is symmetric, meaning that $d_{ij}=d_{ji}$ for all i and j and $d_{ii}=0$ for $i=1,2,\dots,n$. We claim that $[d_{ij}]$ satisfies the triangle inequality if

$$d_{ij}+d_{jk} \geq d_{ik} \text{ for all } 1 \leq i, j, k \leq n \quad (1)$$

What the triangle inequality constraint essentially says is that going from city i to city k through city j can not be cheaper than going directly from city i to city k . This is a reasonable assumption, since the imposed visit to city j appears to be an additional constraint, meaning that can only increase the cost. As a rule of thumb, whenever the entries of the distance matrix represent cost, the triangle inequality is satisfied.

Notice that the graph in this variant of the problem is undirected. If we remove any edge from an optimal path for such a graph, we have a spanning tree for the graph. Thus, we can use an algorithm to obtain a minimum spanning tree, then by going twice around the spanning tree, we can convert it to a path that visits every city. Recalling the transformation from Hamiltonian cycle to traveling salesman problem. Christofides [3] introduced a heuristic algorithm based on the minimum spanning tree for this problem.

Definition 2.1. Hamiltonian Cycle is a cycle in an undirected graph that passes through each node exactly once [7].

Definition 2.2. Given an undirected complete weighted graph, TSP is the problem of finding a minimum cost Hamiltonian Cycle [7].

Christofides' Traveling Salesman Problem (Algorithm 1)

Step 1: Find the minimum spanning tree T using the distance matrix D .

Step 2: Find the nodes of T having odd degree and find the shortest complete matching M in the completed graph consisting of these nodes only. Let G' be the graph with nodes $\{1, 2, \dots, n\}$ and edges in T and M .

Step 3: Find a Hamiltonian cycle in G' .

3.1: Find an Euler cycle $C_0 = (x, y, z, \dots, x)$ in G' .

3.2: Starting at vertex x , we trace C_0 and delete the vertex that has visited before in turn. Then remaining vertices, in the original order in C_0 , determine a Hamilton cycle C , which is a required approximation optimal cycle.

The Prim's algorithm can be used in Step 1.

The number of odd-degree nodes in a graph is even. It's easy to see why this is the case: The sum of the degrees of all nodes in a graph is twice the number of edges in the graph, because each edge increases the degree of both its attached nodes by one. Thus, the sum of degrees of all nodes is even. For a sum of integers to be even it must have an even number of odd terms, so we have an even number of odd-degree nodes.

A matching is a subset of a graph's edges that do not share any nodes as endpoints. A perfect matching is a matching containing all the nodes in a graph (a graph may have many perfect matchings). A minimum cost perfect matching is a perfect matching for which the sum of edge weights is minimum. A minimum cost perfect matching of a graph can be found in polynomial time.

Finding a shortest complete matching in a graph is a version of the *minimal weight matching* problem, in which the total weight of the edges obtained from the matching is minimal. Edmonds and Johnson (1970) [5]; William Cook and André Rohe [6] have presented an efficient algorithm for finding minimum weight perfect in any weighted graph.

The Fleury's algorithm [19] can be used in Step 3.1 for finding Euler cycle.

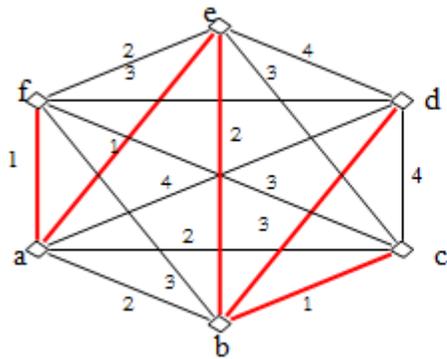


Figure 1. $G(V,E)$ graph

$$D = \begin{Bmatrix} 0 & 2 & 2 & 4 & 1 & 1 \\ 2 & 0 & 1 & 3 & 2 & 3 \\ 2 & 1 & 0 & 4 & 3 & 3 \\ 4 & 3 & 4 & 0 & 4 & 3 \\ 1 & 2 & 3 & 4 & 0 & 2 \\ 1 & 3 & 3 & 3 & 2 & 0 \end{Bmatrix}$$

Figure 2. Distance matrix D

Determining whether a graph contains a Hamiltonian cycle is a computationally difficult problem. In fact, the fastest algorithm known has a worst-case time complexity of $O(n^{2^n})$ in the case of n points. Therefore, the TSP exhibits an exponential worst-case complexity of $O(n^{2^n})$. Proof [4].

Example: $G(V,E)$ graph is illustrated in Figure 1

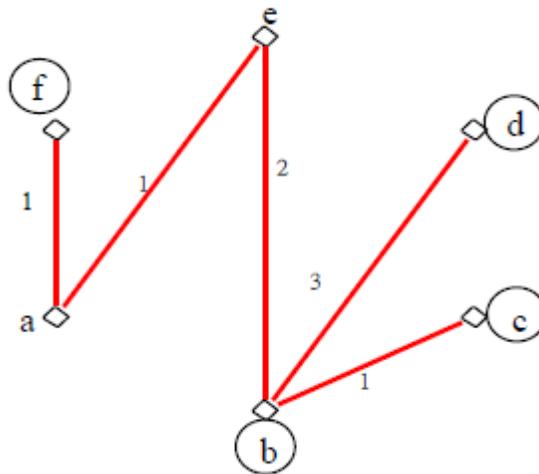


Figure 3. The minimum spanning tree T with the odd-degree vertices encircled

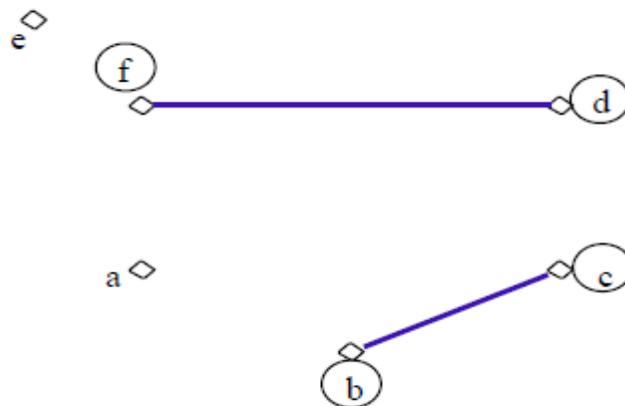


Figure 4. Shows the shortest complete matching M of these odd-degree vertices.

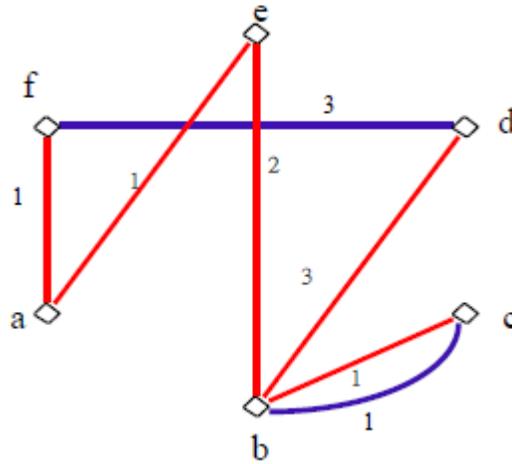


Figure 5. $G'(V, E')$, E' is edges in T and M

We have Euler cycle $C_0 = (a, e, b, c, b, d, f, a)$. Deleting a repeated vertex b from C_0 results in a Hamilton cycle

$C = (a, e, b, c, d, f, a)$ in G with $w(C) = 12$. Because the edge (c, d) of C is not in G' , C corresponds a salesman route $P = (a, e, b, c, b, d, f, a)$ with $w(P) = 12$ which visits each vertex of G at least once (Figure 6).

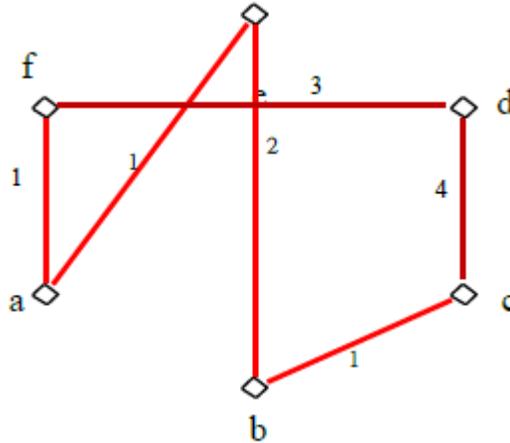


Figure 6. Traveling Salesman tour

For large n , the sequential version of a TSP algorithm becomes impractical. Thus, the need arises to examine a parallel approach in obtaining exact solutions to the TSP problem.

3. THE PARALLEL TRAVELING SALESMAN ALGORITHM

We carry out parallel algorithms on k processors. The parallel is performed in step 1 of the algorithm TSP. Slave processors perform to find MST T . Master processor performs step 2 and step 3 of the algorithm TSP.

Prim's algorithm (Algorithm 2):**Input:** Let $G(V,E)$ be a graph. $V=\{1,2,\dots,n\}$ **Output:** Minimum Spanning Tree $T(B, E')$ (T be a graph).**Step 1:** Initialize $T(1, \emptyset)$. ($B=\{1\}$, $E'=\{\emptyset\}$)**Step 2:** Condition to terminate.

If T has $n-1$ edges, then T becomes Minimum Spanning Tree. Otherwise, then go to Step 3.

Step 3: (Addition)Symbol S is a set as following:

$$S=\{(i, j) \in E \mid i \in B \text{ and } j \notin B\}$$

Find edge $(u, v) \in S$ so that:

$$d_{uv} = \min \{d_{ij} \mid (i, j) \in S\}$$

If $d_{uv} < \infty$ then v is added to B and (u,v) to E' , return to Step 2. Otherwise, $S=\emptyset$ stop.

Parallel Traveling Salesman Problem algorithm (Algorithm 3)**Step 1:** Create k numbers of Slave processes.**Step 2:** Master node send n/k vertex and weight matrix $D(n \times n/k)$ to Slave.**Step 3:** k Slave receives n/k vertex and $D(n \times n/k)$ from the master node.**Step 4:** Master node performs:

If $T(B, E')$ has $n-1$ edges, then T becomes Minimum Spanning Tree.

Otherwise, then go to Step 5.

Step 5: k Slave performs to find:

$$- S_p = \{(i, j) \in E_p \mid i \in B_p \text{ and } j \notin B_p\}$$

- Find edge $(u, v)_p \in M_p$ so that:

$$d_{uv}^p = \min \{d_{ij}^p \mid (i, j) \in S_p \text{ (} p=1,2,\dots,k)\} \quad (2)$$

- Send d_{uv}^p to Master node.

Step 6: Master node finds $d_{xy} = \min \{d_{uv}^p \mid p=1,2,\dots,k\}$

If $d_{xy} < \infty$ then y is added to B and (u,v) to E' ,

Master node sends y vertex and (x,y) edge to k Slave. return to Step 2. Otherwise, stop.

Step 7: Master node receives T which is MST, then go to Step 8.

Step 8: Master node finds the shortest complete matching M

Step 9: Master node finds the Hamiltonian cycle in G' .

The main loop of the Prim algorithm is executed $(n-1)$ times. In each n iteration it scans through all the m edges and tests whether the current edge joins a tree with a nontree vertex and whether this is a smallest edge found so far. Thus, the enclosed loop takes time $O(n)$, yielding the worst-case time complexity of the Prim algorithm as $O(n^2)$. Total parallel time $O(n^2/k + n \log k)$.

Therefore, algorithm 3 reduces more computation time than algorithm 1.

Parallel computing- Brief Overview:

The development of a wide range of parallel machines with large processing capacities high reliability, and low costs, have brought parallel processing into reality as an efficient way for implementing techniques to solve large scale optimization problems. A good choice of the programming environment is essential to the development of a parallel program.

The processes that are executed on parallel machines, are based on different memory organization methods: shared memory; or distributed memory. In shared memory machines, all processors are able to address the whole memory space. The processors can communicate through operations performed by the parallel tasks on the shared memory. Each task shares a common address space. The advantage of this approach is that the communication can be easy and fast. However, the system is limited by the number of paths between the memory and the processors.

An alternative to the shared memory organization is the distributed memory paradigm. In the framework of the distributed memory organization, the memory is physically distributed among the processors. Each processor can only access its own memory, and communication between processors is performed by messages passed through a communication network. A number of parallel programming tools are available to implement parallel programs for distributed memory environments.



Figure 7. Create database (Graph)

So, in this paper we choose the system's computing cluster of Hanoi National University of Education (ccs1.hnue.edu.vn) and use *Parallel java library_PJ* [8], [9].

```

ccs1.hnue.edu.vn - PuTTY
laund@node9:~/mpi$ java -Dpj.nt=1 NCS_LAU_Dulichss 13.txt
Job 97, node2
Start
Shortest Length of TSP      2421
TSP go to vertices
0 , 9 , 7 , 10 , 22 , 3 , 20 , 1 , 5 , 4 , 8 , 12 , 11 , 14
, 15 , 24 , 2 , 6 , 23 , 19 , 17 , 16 , 21 , 13 , 18 , 0
Run time      : 2106 milliseconds

laund@node9:~/mpi$ java -Dpj.nt=2 NCS_LAU_Dulichss 13.txt
Job 98, node3
Start
Shortest Length of TSP      2421
TSP go to vertices
0 , 9 , 7 , 10 , 22 , 3 , 20 , 1 , 5 , 4 , 8 , 12 , 11 , 14
, 15 , 24 , 2 , 6 , 23 , 19 , 17 , 16 , 21 , 13 , 18 , 0
Run time      : 1625 milliseconds

```

Figure 8. Parallel Computing Cluster (ccs1.hnue.edu.vn)

Parallel TSP algorithm is built on ccs1.hnue.edu.vn. The program written in Java and use *Parallel java library (PJ)*. We experimentally sampled nodes as follows: The graph corresponds to 20000 nodes and 30000 nodes. The simulation result is shown in figure 9 and figure 10. This result demonstrates that the runtime of parallel algorithms is better than sequential algorithm.

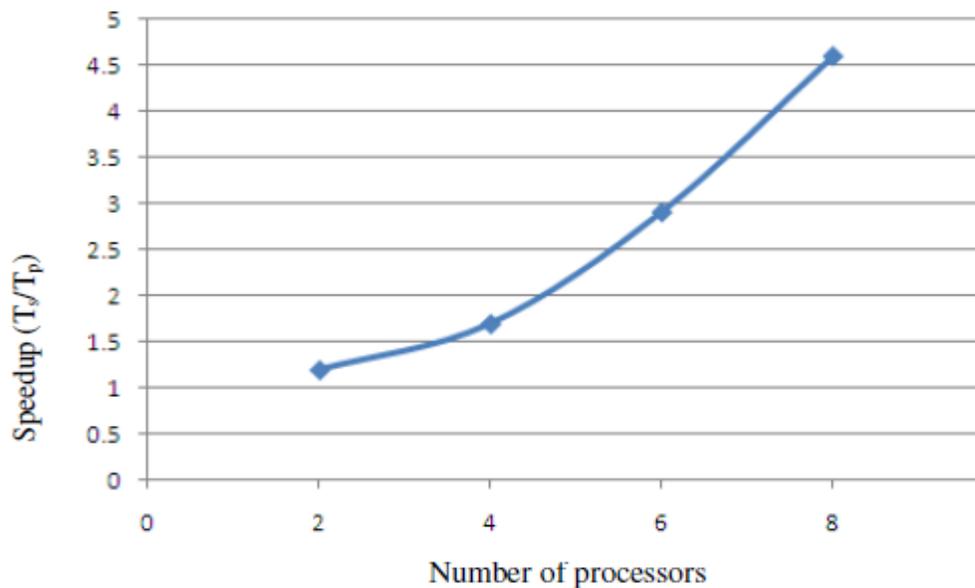


Figure 9. Chart performs the speedup of graph having 20000 nodes

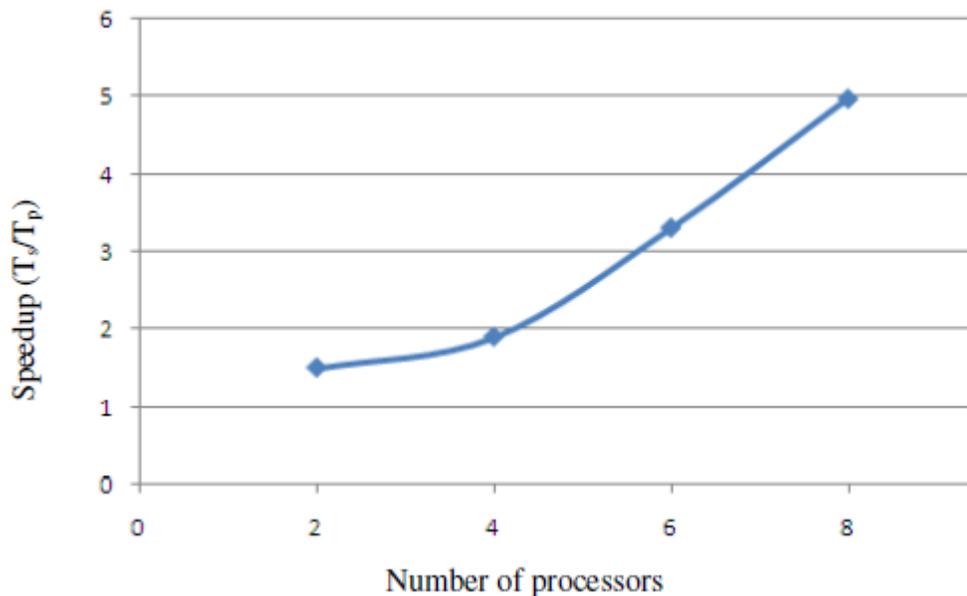


Figure 10. Chart performs the speedup of graph having 30000 nodes

4. CONCLUSION

The detail result of this paper is building sequential and parallel Traveling Salesman Problem algorithm. In addition, to take more advantage of multi-core architecture of the parallel computing system and reduce the computing time of this algorithm, we build this algorithm on multiple processors. Parallel algorithms in this paper are processed at step 1 of the algorithm 1. Ignatios Vakalis 2003 [4] built parallel algorithms by simultaneously looking for DFS (Depth First Search) in step 3 of algorithm 1 to resolve TSP. Random graphs (Figure 7) are created as our database to test the algorithms. As in [4] a small number of vertices graph (less than 12 vertices) are tested. Our algorithms are installed in computer cluster using Parallel Java (PJ) whereas in [4] using MPI. Therefore, our paper has made great contribution to building parallel algorithms using many different libraries.

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