

## Multicast routing algorithm based on tabu search

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**Abstract:** The delay and delay variation-bounded Steiner tree problem is an important multicast routing issue in real-time multimedia networks. Such a constrained Steiner tree problem is known to be NP-complete. A multicast routing algorithm is presented, which is based on tabu search to produce routing trees having a minimal network cost under delay and delay variation constraints. The simulation shows that the algorithm is efficient for actual networks. This approach makes IP multicast utilize resources efficiently in delivering data to a group of members simultaneously.

**Key words:** multicast; tabu search; delay constraint; delay variation constraint

## 0 Introduction

Multicast is a mechanism to efficiently support multi-point communications<sup>[1]</sup>. In order to support real-time applications, network protocols must be able to provide QoS guarantees. Several delay-constrained heuristics have been proposed<sup>[2]</sup>. However, some of these heuristics may fail to provide a low cost tree as they assume that network links are symmetric.

There are several situations in which the need for bounded variation among the path delays takes place. During a teleconference, it is important that the speaker is to be heard by all participants at the same time, otherwise, the communication may lack the feeling of an interactive face-to-face discussion. Rouskas, *et al.*<sup>[3]</sup> presented a heuristic algorithm that was used to construct multicast trees, which guaranteed certain bounds on the end-to-end delays and delay variations. Sheu, *et al.*<sup>[4]</sup> presented a multicast routing scheme on core

based tree(CBT). But they do not attempt to optimize the multicast tree in terms of cost.

Artificial intelligence technique is used for solving this problem because of its success on similar difficult combinatorial problems. For the delay and delay variation-bounded minimum cost multicast routing problem, several heuristics have been proposed<sup>[5-10]</sup>. In this paper, an efficient algorithm is presented, which is based on tabu search<sup>[11]</sup> to produce a low-cost multicast tree with delay and delay variation constraints. This algorithm is called tabu search (TS) for delay and delay variation constraints low-cost multicast routing algorithm (TSDDVMA). TSDDVMA belongs to source-based routing algorithm, because it is assumed that sufficient global information is available to the source. The algorithm starts with an initial shortest path tree constructed by using Sheu's algorithm<sup>[4]</sup>. Then the algorithm constructs a backup-paths-set for each destination using  $K$ -th shortest path

algorithm, and generates neighborhood structure.

## 1 Problem definition

Mathematically, the delay and delay variation-bounded minimum cost multicast routing problem can be formulated as follows. Given a graph  $G = (V, E)$ , with node set  $V$  and edge set  $E$ , define two objective functions,  $c(u, v)$  and  $d(u, v)$ , on each edge  $(u, v) \in E$ . Let  $c(u, v)$  be the cost of edge  $(u, v)$  and  $d(u, v)$  be its delay. Assume that  $c(u, v) = c(v, u)$  and  $d(u, v) = d(v, u)$ . On this graph, there are a source node  $s$ , and a set of destination nodes  $M$ , called the multicast group. The set of vertices from the set  $V - M - \{s\}$  is called Steiner vertices. It tries to construct a delay and delay variation-bounded Steiner tree  $T$  rooted at  $s$ , that spans the destination nodes in  $M$  such that for each node  $v$  in  $M$ , the delay on the path from  $s$  to  $v$  is bounded by a delay constraint  $\Delta$ , and at the same time, the inter-destination delay variation is also bounded by a constraint  $\delta$ . Formally, for each  $v \in M$ , if  $p(s, v)$  is the path in  $T$  from  $s$  to  $v$ , then

$$\sum_{e \in p(s, v)} d(e) \leq \Delta; \quad \forall v \in M \quad (1)$$

$$\left| \sum_{e \in p(s, u)} d(e) - \sum_{e \in p(s, v)} d(e) \right| \leq \delta; \quad \forall u, v \in M \quad (2)$$

Delay and delay variation-bounded minimal cost multicast tree is a delay and delay variation constraints Steiner tree  $T$  such that

$$\text{Cost}(T) = \sum_{e \in T} c(e) \quad (3)$$

is minimized and satisfies the Inequalities (1), (2).

## 2 Multicast routing algorithm with delay and delay variation constraints

The number of possible multicast trees in a computer network of a moderate size is extremely large. Furthermore, because of the multiobjective nature of the problem and the various cost parameters, it is not clear what constitutes the best tree. Modern iterative heuristics such as TS have been found effective in dealing with this category of problems which have an exponential and noisy search space with numerous local optima. These iterative algorithms

are heuristic search methods, which perform a nondeterministic but intelligent walk through the search space.

### 2.1 Initial solution

For the delay and delay variation-bounded Steiner tree problem, Rouskas, *et al.*<sup>[3]</sup> constructed a delay and delay variation constraints Steiner tree, but the algorithm's complexity is high. In this paper, the initial solution  $T_0$  is constructed by using DDVCA<sup>[4,5]</sup>. If DDVCA returns false, then the algorithm may fail to obtain a feasible solution.

### 2.2 Backup-paths-set

For each destination node  $v \in M$ , firstly compute least cost paths from  $s$  to  $v$  by using  $K$ -th shortest path algorithm to construct a backup-paths-set<sup>[7,12-14]</sup>. Let  $B_v$  be the backup-paths-set for destination node  $v$ , then

$$B_v = \{B_v^1, \dots, B_v^l, \dots, B_v^k\} \quad (4)$$

If there are no  $k$  different paths from the source to destination node  $v$  satisfying the delay constraint, it is shown that the delay constraint is too small, then negotiate with destinations node above the delay constraint<sup>[3]</sup>.

### 2.3 Neighborhood structure

A neighbor structure of the solution  $T_{\text{now}}$  is defined as:

$$N(T_{\text{now}}) = \{T \mid T \subseteq G, T = (T_{\text{now}} - p_v^s) \cup B_v^l, \\ v \in M \text{ and } 1 \leq l \leq k\} \quad (5)$$

where  $p_v^s$  is the  $s$ -th backup path for destination node  $v$ .

See the following definitions about the multicast tree. Given a network  $G = (V, E)$  and a multicast tree  $T$ ,  $p(s, v)$  is a path from  $s$  to  $v$ , for  $\forall s, v \in V$ .

**Definition 1** Adding path ( $\cup$ ). Add a path  $p(s, v)$  into  $T$ , denoted by  $T \cup p(s, v)$ ,

$$T \cup p(s, v) = \{e \mid e \in T \text{ or } e \in p(s, v)\} \quad (6)$$

**Definition 2** Deleting path ( $-$ ). Delete a path  $p(s, v)$  from  $T$ , denoted by  $T - p(s, v)$ , where  $s$  is the source node and  $v$  is a destination node,

$$T - p(s, v) = \bigcup_{u \in M, u \neq v} \{e \mid e \in T \text{ and } e \in p(s, u)\} \quad (7)$$

**Theorem 1** Given a network  $G = (V, E)$ , a source node  $s$ , destination node set  $M$ .  $\Delta$  and  $\delta$

are the delay bound and the delay variation bound of multicast session, respectively. Suppose  $T$  is a subtree, and  $\Delta_T < \Delta$ ,  $\delta_T \leq \delta$ .  $Sub(M)$  is the destinations covered in  $T$  so far, and  $Sub(M) \leq M$ . Use  $d_{\max}$  and  $d_{\min}$  to represent the maximal delay and minimal delay of the path among the paths from  $s$  to each destination of  $Sub(M)$  in  $T$ , respectively.  $\forall m \in M$ ,  $m \notin Sub(M)$ , if  $p(s, m)$  satisfies  $\max\{0, d_{\max} - \delta\} \leq d(p(s, m)) \leq \min\{d_{\min} + \delta, \Delta\}$  and  $T' = T \cup p(s, m)$ , then

$$\Delta_{T'} \leq \Delta, \delta_{T'} \leq \delta \quad (8)$$

Theorem 1 shows that the procedure of constructing a feasible tree meets delay and delay variation bounds, if the delay of a path from  $s$  to next uncovered destination satisfies  $\max\{0, d_{\max} - \delta\} \leq d(p(s, m)) \leq \min\{d_{\min} + \delta, \Delta\}$ , and then the tree after adding this path is still a feasible tree<sup>[5]</sup>.

## 2.4 Tabu moves

A tabu list is maintained to prevent returning to previously visited solutions. This list contains information that forbids the search to some extent from returning to a previously visited solution. In approach of this paper, a multicast tree is considered as an element of tabu list.

## 2.5 Aspiration criterion

Aspiration criterion is a device used to override the tabu status of moves whenever it is appropriate. It temporarily overrides the tabu status if the move is sufficiently good. The aspiration criterion must make sure that the reversal of a recently-made move (that is, a move in the tabu list) leads the search to an unvisited solution, generally a better one. In this approach, if the cost of a tabu candidate solution is better than current solution, then it replaces current solution and is considered as new current solution.

## 2.6 Termination rule

A fixed number of iterations have been used as a stopping criterion, and experimented with different values of iterations. It is found that for all the test cases, the TSDDVMA converges within a maximum of 200 iterations. The pseudo code for TSDDVMA is as follows:

Procedure TSDDVMA ( $G = (V, E), s, M, \Delta, \delta, c, d$ )

1.  $T_0 = \text{DDVCA}(G, s, M, \Delta, \delta, d)$ ;
2. If  $T_0 = \text{NULL}$  then return FAILED;
3.  $iter = 0$ ;
4. Generate backup-paths-set by using  $k$ -SPA;
5. while ( $iter < \text{Maxiternum}$ )
6.   Generate neighbor solution  $N(T_{\text{now}})$
7.   Get best solution  $T_{\min} \in N(T_{\text{now}})$
8.   if satisfying aspiration criteria then
9.      $T_{\text{best}} := T_{\min}$ ;  $T_{\text{next}} := T_{\min}$
10.   update tabu list;
11. else
12.   if  $\text{Cost}(T_{\min}) < \text{Cost}(T_{\text{best}})$  then
13.      $T_{\text{best}} \leftarrow T_{\min}$
14.   update tabu list;
15.   end if
16.    $iter \leftarrow iter + 1$
17. end while

## 2.7 Time complexity

**Theorem 2** The time complexity of TSDDVMA is  $O(kmn^3)$ , where  $m$  is group size and  $n$  is network size,  $k$  is the parameter in  $k$ -SPA.

**Proof** The time complexity of generating initial solution by using DDVCA is  $O(mn^2)$ <sup>[4]</sup>, and the complexity of constructing backup-paths-set by using  $k$ -SPA is  $O(kmn^3)$ <sup>[3,7-10,13,14]</sup>. Because one iteration costs  $O(k)$ , thus, for  $Q$  iterations, the cost becomes  $O(Qk)$ . So the worst time complexity of the algorithm is  $O(mn^2 + kmn^3 + Qk)$ . The term  $Qk$  is usually much smaller than  $kmn^3$ , so the time complexity of TSDDVMA is  $O(kmn^3)$ .

## 3 Simulation results and discussion

The TSDDVMA algorithm described in this paper has been tested on several randomly generated networks based on the Waxman's algorithm<sup>[15]</sup>.

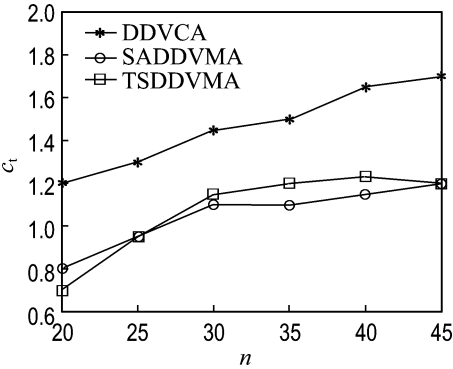
In the first set of experiments, TSDDVMA is compared with DDVCA<sup>[4]</sup> and SADDVMA<sup>[5,6]</sup> for cost performance, where DDVCA is a delay and delay variation-bounded Steiner tree without considering the tree cost. Fig.1 shows the tree cost  $c_t$  for varying network size  $n$  with the group size  $m = 4$  and 6 respectively with an average

node degree of 3,  $\Delta = 0.40$  and  $\delta = 0.20$ . The source nodes and destination nodes vary in each time experiments. It can be seen from Fig. 1 that TSDDVMA has a better cost performance than DDVCA, and is close to SADDVMA, and could construct low-cost trees which satisfy the given delay and delay variation bound and manage the network resources efficiently.

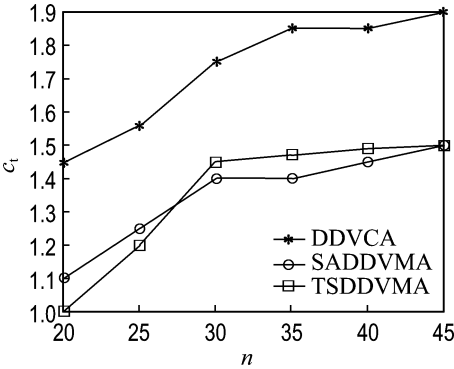
In the second set of experiments, Fig. 2 shows the tree cost for varying network size  $n$  with the group size  $m = 5$ , an average node degree of 3.5

(around) and 4.0 respectively,  $\Delta = 0.40$  and  $\delta = 0.20$ . In general, TSDDVMA has good cost performance and is feasible and effective.

Finally, consider the iteration times of the algorithm. Fig. 3 shows the tree cost for varying iteration times with the number of network nodes  $n = 40$  and 50 respectively, group size  $m = 4, 5$  and 6. The algorithm converges quickly, and has desirable characteristics of approximation iterative heuristics, which satisfies the real-time requirements of multimedia network.

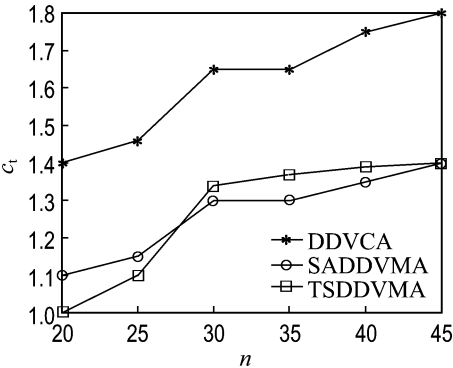


(a) Group size is 4

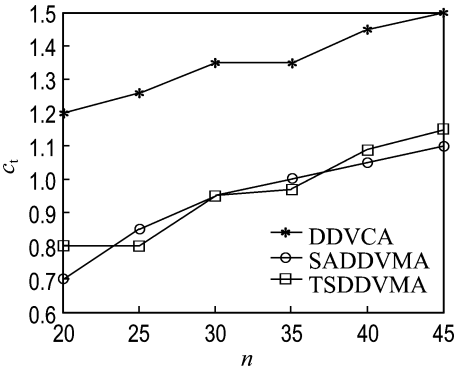


(b) Group size is 6

Fig. 1 Tree cost  $c_t$  versus network size  $n$  for  $\Delta = 0.40$ ,  $\delta = 0.20$  and average node degree 3

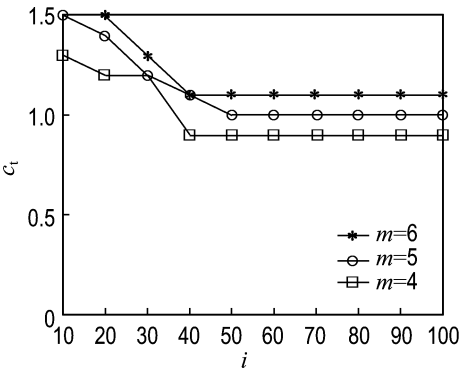


(a) Node degree is 3.5

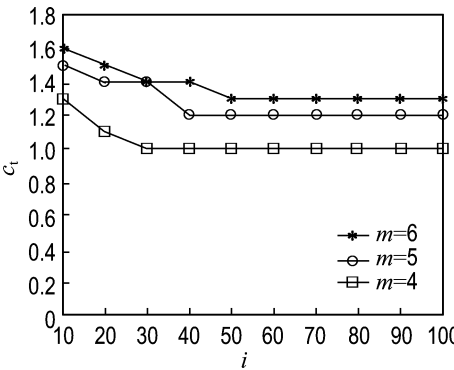


(b) Node degree is 4.0

Fig. 2 Tree cost  $c_t$  versus network size  $n$  for  $\Delta = 0.40$ ,  $\delta = 0.20$  and  $m = 5$



(a) Number of network nodes  $n = 40$



(b) Number of network nodes  $n = 50$

Fig. 3 Tree cost  $c_t$  versus iteration times  $i$  for example network

## 4 Conclusions

Simulations demonstrate that the algorithm of this paper performs excellent performance of cost, rapid convergence and better real-time property.

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# 基于禁忌搜索的组播路由算法

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**摘要:** 实时多媒体网络中,带延迟与延迟抖动约束的斯坦利树问题是一个研究热点.这种带约束的斯坦利树被证明是 NP-完全问题.提出了一种基于禁忌搜索的带延迟与延迟抖动约束最小代价组播路由算法.实验结果表明,该算法对于实际网络是有效的.这种方法使得 IP 组播把数据同时发送到组成员时有效地利用了网络资源.

**关键词:** 组播;禁忌搜索;延迟约束;延迟抖动约束

**中图分类号:** TP393 **文献标志码:** A