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# A Note on Approximation Algorithms for the Multicriteria $\Delta$ -TSP

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#### Abstract

The Tree and Christofides heuristic are well known 1- and  $\frac{1}{2}$ - approximate algorithms for the  $\Delta$ -TSP. In this note their performance for the multicriteria case is described, depending on the norm in  $\mathbb{R}^{Q}$  in case of Q criteria.

### 1 Algorithms

Let G be a complete graph on n nodes and  $w: E(G) \to \mathbb{R}^Q_+$  be a Q-criteria weight function. We assume that the triangle inequality is fulfilled, i.e.  $w(ik) \leq w(ij) + w(jk)$  for all nodes i, j, k of G. Furthermore we assume that  $||.||: \mathbb{R}^Q \to \mathbb{R}$  is a monotonous norm on  $\mathbb{R}^Q$ . Hence  $||a|| \leq ||b||$ whenever  $a \leq b$  for  $a, b \in \mathbb{R}^Q$ , where the order on  $\mathbb{R}^Q$  is the commonly used componentwise order. We first state the extensions of the two algorithms for the case of Q criteria and will then investigate their peformance. In the following text we will always abbreviate feasible Travelling Salesman tours by TS-tours. The weight of a TS-tour T is  $w(T) = (w_1(T), \dots w_Q(T))$  where  $w_i(T) = \sum_{e \in E(T)} w_i(e)$ .

Tree algorithm

Step 1 Let  $\overline{T} \in \operatorname{argmin} \{ ||w(T)|||T \text{ is a spanning tree of } G \}$ 

Step 2 Let G' = (V(G), E'), where E' consists of two copies of each edge of T

Step 3 Find an Eulertour ET in G' and a TS-tour HT embedded in ET.

As  $\overline{T}$  is a spanning tree of G it follows that G' is Eulerian. It is then possible to find a TS-tour in  $\mathcal{O}(n^2)$  time.

#### Christofides algorithm

Step	1	Let $\overline{T} \in \operatorname{argmin} \{   w(T)   T \text{ is a spanning tree of } G \}$
Step	2	Find all nodes in $T$ of odd degree
		Define $G^* := (V^*, E^*)$ where
		$V^* = \{v \in V(G)   v \text{ has odd degree in } \overline{T}\},  E^* = \{(u, v)   u, v \in V^*\}$
Step	3	Let $\overline{M} \in \operatorname{argmin} \{   w(M)     M \text{ is a perfect matching of } G^* \}$
Step	4	Let $G'' = (V(G), E(\overline{M}) \cup E(\overline{T}))$
Step	5	Find an Euler tour $ET$ in $G''$ and the TS-tour $HT$ embedded in $ET$

Note that  $G^*$  is a complete graph on a subset of nodes of G with even cardinality. Thus it contains a perfect matching. Again the resulting graph G'' is Eulerian. Validity of both heuristics, i.e. that they produce a TS-tour, is shown as in the one criterion case and can be found in [5]. The Christofides algorithm was first published in[1]. Note that the triangle-inequality is used when constructing a TS-tour from an Euler tour in G' and G'', respectively.

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## 2 Results

The concept of optimality we use in this note is that of pareto optimal TS-tours. A TS-tour PT is said to be pareto optimal if there does not exist another TS-tour T such that  $w_i(T) \leq w_i(PT)$  for all  $i = 1, \ldots Q$ , with strict inequality in at least one case. In general there obviously exist several pareto optimal tours for an instance of the multicriteria  $\Delta$ -TSP

We will give two definitions of  $\epsilon$ -approximate tours, the first is as follows.

Definition 1 Let HT be a heuristic TS-tour and PT be a pareto optimal TS-tour, then HT is an  $\epsilon$ -approximate tour if

$$\frac{|||w(HT)|| - ||w(PT)|||}{||w(PT)||} \le \epsilon$$

**Theorem 1** The Tree algorithm provides a tour HT, which is a 1-approximate tour for any pareto optimal tour PT.

#### **Proof:**

We have to show that  $-||w(PT)|| \le ||w(HT)|| - ||w(PT)|| \le ||w(PT)||$ . Since the first inequality is trivial we look at the second. From the algorithm  $w(HT) \le 2w(\bar{T}) = w(G')$ , hence

$$||w(HT)|| \le 2||w(\bar{T})||$$
 (1)

since the norm is monotonous. By the choice of T:

$$||w(T)|| \le ||w(PT)|| \tag{2}$$

since removing one edge from PT yields a spanning tree of G. By (1) and (2) we have

$$||w(HT)|| \le 2||w(PT)|| \tag{3}$$

and the claim holds.

Lemma 1 Let PT be a pareto TS-tour. Then there exists some  $\delta \in [0, 1]$  such that  $||w(PT)|| \ge (1+\delta)||w(\bar{M})||$  where  $\bar{M}$  is the perfect matching of Step 3 in the Christofides algorithm.

#### **Proof:**

Let  $\{i_1, \ldots, i_{2m}\}$  be the odd-degree nodes of the spanning tree  $\overline{T}$  as they appear in PT, i.e.

 $PT = \alpha_0 i_1 \alpha_1 i_2 \dots \alpha_{2m-1} i_{2m} \alpha_{2m}$ 

where  $\alpha_i$  are possibly empty sequences of nodes. Let  $M_1 = \{[i_1, i_2], [i_3, i_4], \dots [i_{2m-1}, i_{2m}]\}$  and  $M_2 = \{[i_2, i_3], [i_4, i_5], \dots [i_{2m}, i_i]\}$ . Then by the triangle-inequality  $w(PT) \ge w(M_1) + w(M_2)$ . Now if  $w(\bar{M}) \le w(M_1)$ ,  $w(\bar{M}) \le w(M_2)$  it follows that  $||w(PT)|| \ge ||w(M_1) + w(M_2)|| \ge 2||w(\bar{M})||$ . Otherwise at least  $||w(M_1)|| \ge ||w(\bar{M})||$  and  $||w(M_2)|| \ge ||w(\bar{M})||$  and hence  $||w(M_1) + w(M_2)|| \ge w(M_1) + w(M_2)|| \ge ||w(M_1)||$ .

Given a pareto optimal TS-tour PT we denote the maximal  $\delta \in [0,1]$  for which  $||w(PT)|| \ge (1+\delta)||w(M)||$  holds by  $\delta(PT)$ .

**Theorem 2** Let PT be a pareto optimal TS-tour. Then the TS-tour HT of the Christofides algorithm is a  $\frac{1}{1+\delta(PT)}$ -approximate tour.

#### **Proof:**

We have that  $||w(HT)|| \le ||w(G'')|| = ||w(\bar{T}) + w(\bar{M})|| \le ||w(\bar{T})|| + ||w(\bar{M})||$ . By Lemma 1

$$||w(\bar{M})|| \le \frac{1}{1+\delta(PT)} ||w(PT)||$$
 (4)

Hence (2), which holds here, too, and (4) imply

$$||w(HT)|| \le ||w(PT)|| \left(1 + \frac{1}{1+\delta}\right).$$
 (5)

Theorems 1 and 2 show that the bounds guaranteed by the two heuristics carry over from the one criterion to the multicriteria case, with a weaker result for the Christofides algorithm, when Definition 1 is used.

Nevertheless a more intuitive definition of  $\epsilon$ -approximate solutions for multicriteria problems is the following.

Definition 2 Let HT be a heuristic TS-tour and PT be a pareto optimal TS-tour, then HT is an  $\epsilon$ -approximate tour if

$$\frac{||w(HT) - w(PT)||}{||w(PT)||} \le \epsilon$$

Note that if HT is an  $\epsilon$ -approximate tour in the sense of Definition 2 it is so in the sense of of Definition 1.

We will now restrict ourselves to  $l_p$ -norms, i.e.  $||x|| = \left(\sum_{i=1}^{Q} |x_i|^p\right)^{\frac{1}{p}}$  for  $x \in \mathbb{R}^Q$ , which of course are monotonous norms.

Lemma 2 If  $a_i, b_i \ge 0$   $i = 1 \dots Q$   $p \ge 1$  then

$$\left(\sum_{i=1}^{Q} |a_i - b_i|^p\right)^{\frac{1}{p}} \leq \left(\sum_{i=1}^{Q} (a_i^p + b_i^p)\right)^{\frac{1}{p}}$$

**Proof:** 

Without loss of generality we may assume  $a_i \ge b_i$  i = 1, ..., Q. Hence  $|a_i - b_i| = a_i - b_i \le a_i$  and  $|a_i - b_i|^p \le a_i^p \le a_i^p \le a_i^p + b_i^p$ .

Theorem 3 For the second definition of  $\epsilon$ -approximate solution the following hold.

- 1. The TS-tour HT of the Tree algorithm is a  $(2^p + 1)^{\frac{1}{p}}$ -approximate tour for all pareto optimal TS-tours PT.
- 2. For any pareto TS-tour PT the Christofides algorithm gives a TS-tour HT which is a  $\left(\left(1+\frac{1}{1+\delta(PT)}\right)^p+1\right)^{\frac{1}{p}}$ -approximate tour.

**Proof:** 

1.

$$\frac{||w(HT) - w(PT)||}{||w(PT)||} = \frac{\left(\sum_{i=1}^{Q} |w_i(HT) - w_i(PT)|^p\right)^{\frac{1}{p}}}{\left(\sum_{i=1}^{Q} (w_i(PT))^p\right)^{\frac{1}{p}}}$$

$$\leq \frac{\left(\sum_{i=1}^{Q} \left( \left(w_{i}(HT)\right)^{p} + \left(w_{i}(PT)\right)^{p} \right)^{\frac{1}{p}}\right)}{\left(\sum_{i=1}^{Q} \left(w_{i}(PT)\right)^{p}\right)^{\frac{1}{p}}}$$

$$= \left(\frac{||w(HT)||^{p} + ||w(PT)||^{p}}{||w(PT)||^{p}}\right)^{\frac{1}{p}}$$

$$\leq \left(\frac{2^{p}||w(PT)||^{p} + ||w(PT)||^{p}}{||w(PT)||^{p}}\right)^{\frac{1}{p}}$$

$$= \left(2^{p} + 1\right)^{\frac{1}{p}}$$

where the first inequality follows from Lemma 2 and the second from (3). 2. Analogously

$$\frac{||w(HT) - w(PT)||}{||w(PT)||} \leq \left(\frac{\left(\frac{2+\delta}{1+\delta}\right)^p ||w(PT)||^p + ||w(PT)||^p}{||w(PT)||^p}\right)^{\frac{1}{p}}$$
$$= \left(\left(\frac{2+\delta}{1+\delta}\right)^p + 1\right)^{\frac{1}{p}}$$

where we made use of (5) and again of Lemma 2.

Thus for  $p \to \infty$  the Tree algorithm gives a 2-approximate tour, the Christofides algorithm a  $\left(1 + \frac{1}{1+\delta}\right)$ -approximation. These values could be calculated dirctly using  $||x||_{\infty} = \max_{i=1...Q} |x_i|$  in Theorem 3.

The first part of Theorem 3 as well as Theorem 1 are from a thesis of the second author [2]. Figure 1 shows the values of  $\epsilon(p) = (2^p + 1)^{\frac{1}{p}}$  and  $\epsilon(p) = (\frac{3^p}{2} + 1)^{\frac{1}{p}}$ , i.e.  $\delta = 1$ . For  $\delta = 0$  both values are the same.

### 3 Remarks

Another possibility to define  $\epsilon$ -approximate solutions would be to require

$$\frac{|w_i(HT) - w_i(PT)|}{|w_i(PT)|} \le \epsilon \quad i = 1, \dots Q$$

But there is no known procedure to guarantee that even for a given pareto TS-tour PT. Note that equations (2), (4) do not hold componentwise in general.

Another remark is on the problem of finding a norm-minimizing spanning tree or perfect matching, which are essential steps in the two algorithms.

In case  $||x|| = ||x||_1 = \sum_{i=1}^{Q} |x_i|$  we have that for  $S \subseteq E$   $||w(S)|| = \sum_{i=1}^{Q} \sum_{e \in S} w_i(e) = \sum_{e \in S} \left( \sum_{i=1}^{Q} w_i(e) \right)$  and can solve the tree and matching problems as one criterion problems with  $w'(e) = \sum_{i=1}^{Q} w_q(e)$ , and thus in polynomial time.

with  $w'(e) = \sum_{i=1}^{Q} w_q(e)$ , and thus in polynomial time. In case  $||x|| = ||x||_{\infty} = \max |x_i|$ , however,  $||w(S)|| = \max_{i=1...Q} \sum_{e \in S} w_i(e)$  and to find a norm minimizing spanning tree or matching is the Max-Ordering spanning tree and Max-Ordering matching problem. Both of these problems are known to be NP-hard, see [3] and [4].



Figure 1: Performance guarantee for  $l_p$  norms

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