PERGAMON

# Local Search Structure in the Symmetric Travelling Salesperson Problem under a General Class of Rearrangement Neighborhoods 

J. W. Barnes<br>Graduate Program in Operations Research and Industrial Engineering<br>The University of Texas at Austin<br>Austin, TX 78712, U.S.A.<br>wbarnes@mail.utexas.edu<br>B. W. Colletti<br>Chief of Military and Industrial Studies<br>SeiCorp, Inc., 13890 Braddock Road, Suite 312<br>Centreville, VA 20121-2435, U.S.A.<br>www.seicorp-inc.com<br>bcolletti@computerserve.com

(Received October 1999; accepted November 1999)


#### Abstract

The symmetric travelling salesperson problem with $n$ cities (1-STSP) possesses no arbitrarily poor local optima for search neighborhoods defined by arbitrary unions of conjugacy classes in the symmetric group on $n$ letters, $S(n)$.(c) 2000 Elsevier Science Ltd. All rights reserved.


Keywords-TSP, Symmetric group, Rearrangement neighborhood, Conjugacy class.

Colletti and Barnes [1] detailed how the conjugacy class of $n$ cycles in $S(n)$ may be viewed as the set of all solutions, or tours, to the symmetric travelling salesperson problem with one agent (1STSP). Large 1-STSPs overwhelm exact solution methods, causing recourse to heuristic methods like the tabu search metaheuristic [2] which iteratively chooses a new solution from among those in the neighborhood of a previously obtained incumbent solution. In this paper, we use group theory to reveal a useful property common to a general class of rearrangement neighborhoods.

In earlier work, Grover [3] and Codenotti and Margara [4,5] showed that four specific elementary 1-STSP neighborhoods-2-city swap, $2+3$-new-change, 3-new-change, and 2-opt-satisfy a simple homogeneous linear difference equation

$$
\begin{equation*}
\nabla^{2} f+\frac{k}{n} f=0 \tag{1}
\end{equation*}
$$

where $n$ is the number of cities; $k>0$ is a constant which depends on the neighborhood; and for tour $p, f(p)$ is the tourlength of $p$ minus the average tourlength of all tours, $\mu$. Finally, $\nabla^{2} f(p)$ denotes the average of all $f(q)-f(p)$, where $q$ is a neighbor of $p$. Grover [3] shows that the

[^0]tourlength of any local optimum of any duplicative 1-STSP neighborhood (not only the above four) does not exceed $\mu$, i.e., arbitrarily poor local optima cannot exist for such neighborhoods. A duplicative neighborhood is one whose construction method admits duplicate members; and henceforth, we presume such neighborhoods.

Let $|C|$ denote the cardinality of $C \subseteq S(n)$. For any $n$-cycle $p \in S(n)$, define $p^{C} \equiv\left\{p^{c}=c^{-1} p c\right.$ : $c \in C\}$ to be the $C$-rearrangement neighborhood of $p$. Note, that each element of $C$ contributes a neighbor, and so $p^{C}$ is a duplicative neighborhood since there may be distinct $x, y \in C$ such that $p^{x}=p^{y}$. When $C$ is a conjugacy class of $S(n),[1]$ showed that in the multiple asymmetric TSP (m-ATSP), the summed neighbor tourlengths-denoted weight[tourlength, $p^{C}$ ]-is linear in the tourlengths of $p$ and its inverse. Thus, for the m-STSP and $n>3$, this weight is linear in tourlength $(p)$
weight [tourlength, $\left.p^{C}\right]=\left(2 c_{2}+(n-4) c_{4}+2 c_{6}\right)$ Sum $D+\left[c_{1}-2 c_{2}+2 c_{4}+c_{5}-2 c_{6}\right]$ tourlength $(p)$,
where $\operatorname{Sum} D$ is the sum of all elements in the arbitrary symmetric zero-diagonal $n$ by $n$ distance matrix, and $c_{i}$ is described in [1]. The neighborhood $f$-weight of $p$, denoted weight $\left[f, p^{C}\right]$, is the summed $f$ values of $p$ 's neighbors.

A conjugacy class of $S(n)$ consists of all permutation having a given cycle structure. Thus, the set of all two-cycles in $S(4)$ is the conjugacy class $C_{(x, x)} \equiv\{(1,2),(1,3),(1.4),(2,3),(2,4),(3,4)\}$, while the conjugacy class of three-cycles is $C_{(x, x, x)} \equiv\{(2,3,4),(2,4,3),(1,2,3),(1,2,4),(1,3,2)$, $(1,3,4),(1,4,2),(1,4,3)\}$. If $p$ is a derangement in $S(n)$, i.e., a permutation that moves all $n$ letters, then the neighborhood of $p$ consisting of all possible two-letter swaps on $p$ is given by $p^{C_{(x, x)}}$. Likewise, all possible three-letter swaps are given by $p^{C_{(x, r, x)}}$.

However, the set of all four-letter swaps is given by $p^{C}$, where $C=C_{(x, x, x, x)} \cup C_{(x, x)(x, x)}$. In general, $p^{C}$ are all $k$-letter rearrangements on derangement $p$, where $C$ is the union of all conjugacy classes whose cycle structures move $k$ letters. Again, $p^{C}$ may contain duplicates since each element in $C$ creates a neighbor. Until otherwise stated, $C$ henceforth denotes a single conjugacy class of $S(n)$.

When applied to the $n$-city 1 -STSP, equation (2) may be used to prove any $C$-rearrangement neighborhood satisfies equation (1), and so has no arbitrarily poor local optima. To see this, simply manipulate equation (1) to obtain

$$
\begin{equation*}
k=n-\frac{n}{\nu} \frac{\text { weight }\left[f, p^{C}\right]}{f(p)}>0 \tag{3}
\end{equation*}
$$

where $\nu=\left|p^{C}\right|=|C|$, a constant $\forall p \in S(n)$. Because equation (1) presumes $k$ is constant, then so is

$$
\begin{equation*}
\rho=\frac{\text { weight }\left[f, p^{C}\right]}{f(p)}<\nu \tag{4}
\end{equation*}
$$

Since this argument can be reversed, it follows that a constant $\rho<\nu$ implies the 1-STSP $C$ rearrangement neighborhood satisfies equation (1).

To show that any $C$-rearrangement neighborhood respects equation (1), we need only show its $\rho$ value satisfies equation (4). First, it is well known that $\operatorname{SUM} D=(n-1) \mu$, and so

$$
\begin{align*}
\text { weight }\left[f, p^{C}\right]= & \text { weight }\left[\text { tourlength, } p^{C}\right]-|C| \mu=\left[2 c_{2}+(n-4) c_{4}+2 c_{6}\right](n-1) \mu  \tag{5}\\
& +\left[c_{1}-2 c_{2}+2 c_{4}+c_{5}-2 c_{6}\right] \text { tourlength }(p)-|C| \mu
\end{align*}
$$

where as stated earlier

$$
\begin{equation*}
f(p)=\operatorname{tourlength}(p)-\mu \tag{6}
\end{equation*}
$$

For the reader's convenience, the arc transformation table from [1] is given in Table 1.

Table 1. Arc transformation table.

| Transformed <br> arc | $\tau$ | $\left[x, \neq x^{p}\right]$ | $\left[\neq x, x^{p}\right]$ | $\left[\notin\left\{x, x^{p}\right\}\right.$ <br> $\left.\notin\left\{x, x^{p}\right\}\right]$ | $\left[x^{p}, x\right]$ | $\left[x^{p}, \neq x\right]$ | $\left[\neq x^{p}, x\right]$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\# C$-elements | $c_{1}$ | $c_{2}$ | $c_{3}\left(=c_{2}\right)$ | $c_{4}$ | $c_{5}$ | $c_{6}$ | $c_{7}\left(=c_{6}\right)$ |
| Arc variates | 1 | $n-2$ | $n-2$ | $P(n-2,2)$ | 1 | $n-2$ | $n-2$ |

Table 1 presents the seven transformation of $p$-arc $\tau=\left[x, x^{p}\right]$ under conjugation by $C . c_{k}$ elements in $C$ transform $\tau$ into a specific column header arc $\alpha$, and the bottom row gives the number of variants of $\alpha$. For example, if $\tau=[1,2]$, then $c_{2}$ elements in $C$ change $\tau$ into $\alpha=[1,3]$, one of the $n-2$ variants $\{[1,3],[1,4], \ldots,[1, n]\} . P(n, m)$ denotes the number of permutations on $n$ choose $m$ letters.
Thus, $|C|$ is the summed pairwise products of corresponding elements from the second and third rows of Table 1

$$
\begin{align*}
|C| & =1^{*} c_{1}+(n-2)^{*} c_{2}+(n-2)^{*} c_{3}+P(n-2,2)^{*} c_{4}+1^{*} c_{5}+(n-2)^{*} c_{6}+(n-2)^{*} c_{7} \\
& =c_{1}+2(n-2) c_{2}+(n-2)(n-3) c_{4}+c_{5}+2(n-2) c_{6} . \tag{7}
\end{align*}
$$

Substituting equations (5)-(7) into equation (4) and simplifying yields the constant

$$
\begin{equation*}
\rho=c_{1}-2 c_{2}+2 c_{4}+c_{5}-2 c_{6}<|C| . \tag{8}
\end{equation*}
$$

Thus, any 1-STSP $C$-rearrangement neighborhood satisfies equation (1) with an associated $k$ coefficient

$$
\begin{equation*}
k=n\left[1+\frac{2\left(c_{2}-c_{4}+c_{6}\right)-c_{1}-c_{5}}{|C|}\right]>0 . \tag{9}
\end{equation*}
$$

In turn, this neighborhood has no arbitrarily poor local optima. Now, if $C$ is the union of arbitrary conjugacy classes $\left\{C_{i}\right\}_{i \in I}$ in $S(n)$, then

$$
\begin{equation*}
\frac{\text { weight }\left[f, p^{C}\right]}{f(p)}=\sum_{i \in I} \frac{\text { weight }\left[f, p^{C_{i}}\right]}{f(p)} \tag{10}
\end{equation*}
$$

Since each summand in equation (10) is constant and less than its $\left|C_{i}\right|$, their sum must be constant and less than $|C|$, the sum of all the $\left|C_{i}\right|$. Thus, this $C$-rearrangement neighborhood satisfies equation (1) with $k$ coefficient

$$
\begin{equation*}
k=n-n \frac{\text { weight }\left[f, p^{C}\right] / f(p)}{\sum_{i \in I}\left|C_{i}\right|}=n\left[1-\frac{\sum_{i \in I}\left(\text { weight }\left[f, p^{C_{i}}\right] / f(p)\right)}{\sum_{i \in I}\left|C_{i}\right|}\right] . \tag{11}
\end{equation*}
$$

This result generalizes upon and proves the (specific) conjecture of [4] that says the 1-STSP $\{2+\cdots+m\}$-letter rearrangement move satisfies equation (1).
In closing, results found here are subsumed by more general $m$-STSP results presented in [6]. For example, equation (2) holds for the $m$-STSP, i.e., $p$ need not be an $n$-cycle (a solution to the 1-TSP). All other equations hold for any deranged $m$-STSP, i.e., $p$ is any derangement (an $n$-cycle is a special type of derangement). The authors focused upon the more familiar 1-STSP because once understood, this paper's application to the $m$-STSP becomes clear.

## REFERENCES

[^1]3. L. Grover, Local search and the local structure of NP-complete problems, Operations Research Letters 12 (4), 235-243 (1992).
4. B. Codenotti and L. Margara, Local properties of some NP-complete problems. TR-92-021, International Computer Science Institute, University of California at Berkeley (1992).
5. B. Codenotti and L. Margara, Traveling salesman problem and local search, Appl. Math. Lett. 5 (4), 69-71 (1992).
6. B. Colletti, Group Theory and Metaheuristics, Ph.D. Dissertation, The University of Texas at Austin, (1999).


[^0]:    0893-9659/00/\$ - see front matter (C) 2000 Elsevier Science Ltd. All rights reserved. Typeset by $\mathcal{A}_{\mathcal{M}} \mathcal{S}-\mathrm{T}_{\mathrm{E}} \mathrm{X}$ PII: S0893-9659(00)00120-8

[^1]:    1. B. Colletti and J.W. Barnes, Linearity in the traveling salesman problem, Appl. Math. Lett. 13 (3), 27-32 (2000).
    2. F. Glover and M. Laguna, Tabu Search, Kluwer Academic, Boston, MA, (1997).
