

\\ 142 \\

**A Lagrangean Heuristic for the  
Prize Collecting Travelling  
Salesman Problem**

di

Mauro Dell'Amico  
F. Maffioli  
A. Sciomachen

Maggio 1996

Università degli Studi di Modena  
Dipartimento di Economia Politica  
Viale Berengario, 51  
41100 Modena (Italia)  
e-mail: [dellamico@unimo.it](mailto:dellamico@unimo.it)



# A Lagrangean Heuristic for the Prize Collecting Travelling Salesman Problem

M. Dell'Amico<sup>1</sup>, F. Maffioli<sup>2</sup>, A. Sciomachen<sup>3</sup>

1. Università di Modena, Dip. di Economia Politica, Via Berengario 51, 41100 Modena, Italy

2. Politecnico di Milano, Dip. di Elettronica ed Informazione, Piazza Leonardo da Vinci 32, 20133 Milano, Italy

3. Università degli Studi di Genova, Istituto di Matematica Finanziaria, Via Bertani 1, 16125 Genova, Italy

## Abstract

In this paper we consider the Prize Collecting Travelling Salesman Problem (PCTSP), that is a variant of the Travelling Salesman Problem (TSP) where a tour visiting each node at most once in a given graph has to be computed, such that a prize is associated with each node and a penalty has to be paid for every unvisited node; moreover, a knapsack constraint guarantees that a sufficiently large prize is collected. We develop a Lagrangean heuristic and obtain an upper bound in the form of a feasible solution starting from a lower bound to the problem recently proposed in the literature. We evaluate these bounds utilizing both randomly generated instances and real ones with very satisfactory results.

## 1. Introduction and problem definition

The Prize Collecting Travelling Salesman Problem (PCTSP) can be considered as a variant of the Travelling Salesman Problem (TSP), where the Hamiltonian constraint is not anymore required, but a penalty has to be paid for any node left unvisited in the (simple) tour of the salesman that collects prizes at every visited node.

More formally, the PCTSP can be defined as follows. A weighted digraph  $G = (V, A)$  is given, where  $V$  is the set of nodes of size  $n$  and  $A$  is the set of arcs of size  $m$ . Let us suppose that  $V = \{1, 2, \dots, n\}$  and that node 1 is the depot or home city of the salesman. A cost  $c_{ij}$  is associated with each arc  $(i, j) \in A$ , and a prize  $p_i$  is associated with each node  $i \in V$ . Moreover, a penalty  $\gamma_i$  to be paid if node  $i$  is not visited is given  $\forall i \in V$ . Node 1 is then such that  $p_1 = 0$  and  $\gamma_1 = +\infty$ .

The PCTSP consists in finding a cycle  $\chi = (V_\chi, A_\chi)$ ,  $V_\chi \subseteq V$ ,  $A_\chi \subseteq A$ , with  $1 \in V_\chi$  visiting each node at most once, such that the total cost and penalties to be paid are minimized and the collected prize is not less than a given amount  $B$ .

Introducing the binary variables  $x_{ij} = 1$  if arc  $(i, j) \in A_\chi$  and 0 otherwise, and  $y_i = 1$  if node  $i \in V_\chi$  and 0 otherwise, the PCTSP can be formulated as an Integer Programming Problem as follows.

$$\min \sum_{i \in V} \sum_{j \in V^i} c_{ij} x_{ij} + \sum_{i \in V} \gamma_i (1 - y_i) \quad (1.1)$$

$$\text{s.t.} \quad \sum_{j \in V^i} x_{ij} = y_i \quad \forall i \in V \quad (1.2)$$

$$\sum_{i \in V^j} x_{ij} = y_j \quad \forall j \in V \quad (1.3)$$

$$y_1 = 1 \quad (1.4)$$

$$\sum_{i \in V} p_i y_i \geq B \quad (1.5)$$

$$\sum_{i \in S} \sum_{j \in V^i \setminus S} x_{ij} \geq y_h \quad \forall h \in V \setminus 1 \text{ and } \forall S \subset V: \{1\} \in S, h \in V \setminus S \quad (1.6)$$

$$x_{ij} \in \{0, 1\} \quad \forall (i, j) \in A \quad (1.7)$$

$$y_i \in \{0, 1\} \quad \forall i \in V \quad (1.8)$$

(1.1) is our objective function expressing the minimization of the costs of the arcs included in the cycle and of the penalties to be paid for the unvisited nodes. (1.2) and (1.3) are the well known assignment constraints and (1.4) forces the depot to be included in the cycle. Constraint (1.5) is a knapsack-like constraint and ensures that the total collected prize is not less than a given value, that can be defined as our “goal”. (1.6) forces every node in  $V_x$  to be connected to the depot, and give the so-called Subtour Elimination Constraint. Finally, (1.7) and (1.8) are the constraints on the variables of the problem.

The PCTSP has been introduced by Balas and Martin (1985) as a model for scheduling the daily operations of a steel rolling mill. The same optimization problem has been successively addressed by the same authors Balas and Martin (1991) and more recently by Baccus et al. (1995). A more detailed model for the general steel hot rolling process is given in Cowling (1995), where Tabu Search heuristic techniques are utilized.

Structural properties of the PCTSP related to the TSP polytope and to the knapsack polytope have been presented by Balas (1989, 1995). Bounding procedures, based on different relaxations, have been developed by Fischetti and Toth (1988) and Dell’Amico, Maffioli and Värbrand (1995).

A variant of the PCTSP is given by the *Profitable Tour Problem* (PTP) which is obtained from PCTSP by removing constraints (1.4) and (1.5) and setting  $\gamma_i = 0$ . In the PTP we allow the “empty” solution  $x_{ij} = 0 \forall (i,j) \in A$ . In practice, one can choose either the solution which visits zero nodes and pays  $\sum_{i=2}^n \gamma_i$  or a solution which performs a cycle including node 1 and pays a mixture of penalties  $\gamma_i$  and costs  $c_{ij}$ . The most profitable cycle is chosen.

Related problems are the *Selective TSP* (Laporte and Martello (1990)) and the *Orienteering Problem* (Golden et al. (1987, 1988)), which are obtained by PCTSP substituting the objective function (1.1) with the maximization of the prizes collected and substituting the knapsack constraint with a bound on the length of the cycle.

In this paper we present a Lagrangean heuristic for solving problem (1.1)-(1.8). In particular, in Section 2 we briefly describe the lower bound for PCTSP presented in Dell’Amico, Maffioli and Värbrand (1995) that gives our starting solution and we give the basic steps for making this starting solution feasible. Our Lagrangean heuristic based on an *Extension and Collapse* procedure is described in Section 3. Section 4 reports on our experimental results based on both random instances and instances of steel rolling mill derived from real applications.

## 2. Finding feasible solutions

In this section we first briefly describe the lower bound for PCTSP that is used in the present work for generating starting solutions for the heuristic procedures proposed in the following sections. Then we show how we make these starting solutions feasible.

### 2.1 Our starting solution: a lower bound for PCTSP

The lower bound LB that is used for generating our starting solutions derives from the work presented in Dell’Amico, Maffioli and Värbrand (1995).

The approach used to obtain a lower bound for PCTSP originates from the following more compact formulation of the problem (see Balas (1989)) obtained by eliminating variables  $y_i$ ,  $i = 1, \dots, n$ , by substituting them with  $x_{ii} = 1 - y_i \forall i \in V$ .

$$\min \sum_{i \in V} \sum_{j \in V} b_{ij} x_{ij} \tag{2.1}$$

$$\text{s.t.} \quad \sum_{j \in V} x_{ij} = 1 \quad \forall i \in V \tag{2.2}$$

$$\sum_{i \in V} x_{ij} = 1 \quad \forall j \in V \quad (2.3)$$

$$\sum_{i \in V} p_i x_{ii} \leq \sum_{i \in V} p_i - B \quad (2.4)$$

$$\sum_{i \in S} \sum_{j \in V \setminus S} x_{ij} \geq 1 - x_{hh} \quad \forall h \in V \setminus 1 \text{ and } \forall S \subset V: \{1\} \in S, h \in V \setminus S \quad (2.5)$$

$$x_{ij} \in \{0,1\} \quad \forall (i,j) \in A \quad (2.6)$$

where  $b_{ij} = c_{ij}$  if  $i \neq j$ , otherwise  $b_{ij} = +\infty$  if  $i = j = 1$  and  $b_{ij} = \gamma_i$  if  $i = j \neq 1$ .

Note that the new variables  $x_{ij}$  have now the “reverse” interpretation, i.e.  $x_{ii} = 1$  if node  $i$  is not included in the cycle and 0 otherwise. In the graph theory terminology,  $x_{ii} = 1$  identifies a loop incident to node  $i$ .

Model (2.1)-(2.6) is relaxed in a Lagrangean fashion by embedding constraint (2.4) in the objective function (2.1), by means of a parameter  $\lambda \geq 0$ . The new objective is then

$$L(\lambda, x) = \sum_{i \in V} \sum_{j \in V \setminus i} d_{ij} x_{ij} + \lambda \left( B - \sum_{i \in V} p_i \right) \quad (2.7)$$

with  $d_{ij} = c_{ij}$  if  $i, j \in V, i \neq j$ ,  $d_{ii} = b_{ii} + \lambda p_i$  for  $i \in V$ .

The resulting problem is an Asymmetric PTP (APTP). The APTP can be polynomially reduced to the Asymmetric TSP on a larger digraph  $G'$  (see Dell'Amico, Maffioli and Värbrand (1995)), such that there is an one-to-one correspondence between the subtours in  $G$  which include node 1 and the Hamiltonian tours in  $G'$ , and their costs are identical.

In many cases the NP-hard problem ATSP can be solved within small computational times, as shown in Carpaneto, Dell'Amico and Toth (1995) where the FORTRAN listing of a branch and bound algorithm called CDT is given. Since our enlarged graph  $G'$  has  $2n+1$  nodes, but only  $n^2+3n-1$  arcs, we modified code CDT so as to take advantage from sparsity. Algorithm CDT, at the root node, solves an assignment problem on a full density matrix, then defines a sparse matrix to be used during the exploration of the branch decision tree. Thus we substituted the original procedure used to solve the assignment problem with a FORTRAN version of the algorithm SPJV (Jonker and Volgenant (1987)).

Let  $\Omega$  be the set of all feasible solutions to APTP: a subgradient technique can be used to solve the dual problem  $\max \{L(\lambda, x) : \lambda \geq 0, x \in \Omega\}$ . We started using as initial value for  $\lambda$  the dual value associated with the optimal solution to the continuous knapsack problem, in minimization form:  $\min$

$\left\{ \sum_{i=1}^n w_i y_i : \sum_{i=1}^n p_i y_i \geq B, 0 \leq y_i \leq 1, i = 1, \dots, n \right\}$ , where  $w_i = \min \{c_{hi} : h = 1, \dots, n, h \neq i\} - \gamma_i$  is the minimum cost that one has to pay to include node  $i$  in the cycle instead of leaving it unrouted.

## 2.2 Obtaining feasibility

In this section we describe the basic steps for obtaining feasible solutions for PCTSP starting from the cycle  $\chi$  obtained in Section 2.1 when it is not optimal. Note that, as it will be explained in more details while showing our computational results, when  $\gamma_i = 0 \quad \forall i \in V$  almost all the starting cycles are not feasible, while they are frequently feasible when the value of  $\gamma$  becomes larger.

Our first proposed step for obtaining feasible solutions is procedure **Adding-Nodes** which works as follows: add to  $\chi$  one node  $j \in V \setminus V_\chi$  at a time until the sum of the prizes of the nodes belonging to  $V_\chi$  is at least  $B$ .

In the following we will use the ordered sequence of nodes  $C = (v_1, v_2, \dots, v_k, v_{k+1})$  with  $v_{k+1} = v_1$  and  $(v_i, v_{i+1}) \in A_\chi$  for  $i = 1, \dots, k$ , to identify cycle  $\chi$ .

In order to choose node  $j \in V \setminus V_x$  to be added to  $C$  the following two inserting rules have been evaluated.

**Rule R1.** Choose node  $j \in V \setminus V_x$  to add to  $C$ , in such a way that the resulting cycle cost is minimized, i.e. add  $j \notin C$  between  $v_i$  and  $v_{i+1} \in C$  with

$$j, v_i : c_{v_i j} + c_{j v_{i+1}} - c_{v_i v_{i+1}} - \gamma_j = \min \{ c_{v_h k} + c_{k v_{h+1}} - c_{v_h v_{h+1}} - \gamma_k : k \notin C, v_h \in C \} \quad (2.8)$$

This rule is a straightforward adaptation of the classical ‘‘cheapest insertion’’ rule used in greedy algorithms for TSP.

A rule which takes into account also the prizes of the nodes (and implicitly the knapsack constraint) is

**Rule R2.** Choose node  $j \in V \setminus V_x$  to add to  $C$ , in such a way that the ratio ‘‘prize / cost’’ is maximized, i.e. add  $j \notin C$  between  $v_i$  and  $v_{i+1} \in C$  with

$$j, v_i : \frac{p_j}{c_{v_i j} + c_{j v_{i+1}} - c_{v_i v_{i+1}} - \gamma_j} = \max \{ p_k / (c_{v_h k} + c_{k v_{h+1}} - c_{v_h v_{h+1}} - \gamma_k) : k \notin C, v_h \in C \} \quad (2.9)$$

As a complexity analysis, note that each iteration of *Adding-Nodes Procedure* requires computational time  $\mathbf{O}(n^2)$ .

Both rules R1 and R2 have been evaluated on the same random instances with  $n$  ranging from 20 to 500,  $c_{ij} \in [0, 1000] \forall (i, j) \in A$ ,  $p_i \in [0, 100]$ ,  $\gamma_i \forall i \in V$ . The results related to feasible solutions obtained by applying rules R1 and R2 are reported in Table 1, where **R1** and **R2** give the average ratio (20 entries each) between the objective function value of the solution obtained after applying *Adding-Nodes Procedure* and the value LB of the lower bound obtained as described in Section 2.1.

n	$\alpha = 0.2$		$\alpha = 0.5$		$\alpha = 0.8$	
	R1	R2	R1	R2	R1	R2
20	1.7296	1.7984	1.3368	1.2454	1.0803	1.0958
40	1.5253	1.4775	1.4200	1.2601	1.1813	1.1369
60	1.9103	1.8283	1.1744	1.1416	1.0815	1.0807
80	1.5114	1.5410	1.1505	1.1358	1.0904	1.1146
100	1.4650	1.4206	1.3331	1.1962	1.0924	1.0615
200	1.5508	1.5421	1.1196	1.0899	1.0445	1.0358
300	1.5936	1.4644	1.1579	1.1197	1.0875	1.0639
400	2.3807	2.0305	1.0445	1.0553	1.0548	1.0332
500	1.9085	1.7227	1.1258	1.0602	1.0306	1.0261

*Table 1. Average ratio between our first upper bound (rules R1 and R2) and the lower bound.*

In Table 1 and in all the following ones, we denote by  $\alpha$  the percentage of the sum of the prizes used for determining the knapsack constraint, i.e. the value for constraint (1.5) is computed according to relation

$$B = \alpha \sum_{i \in V} p_i \quad (2.10)$$

In all our computational results we fix  $\alpha = 0.2, 0.5$  and  $0.8$ .

Looking at Table 1, we can see that rule R1, that is based on the cost minimization, gives generally worse results than R2 for all values of  $n$  and  $\alpha$  except for few cases. Note also how the solutions provided by *Adding-Nodes Procedure* are closer to LB when  $\alpha$  increases.

As a further comparison between the two proposed inserting rules, it is worth mentioning that the number of iterations, i.e. the number of nodes added to  $C$ , performed by our procedure in the case of rule R1 and R2 is definitely in favour of R2; in fact, R1 requires on the average from 24% to 88% more iterations than rule R2, except in a single case ( $n = 100$  and  $\alpha = 0.2$ ). Moreover, note that at most  $\frac{19}{100}n$  and  $\frac{16}{100}n$  iterations are performed by *Adding-Node Procedure* when using R1 and R2, respectively.

On the basis of this last evaluation and on the results given in Table 1, rule R2 has been selected and used in all our next computations. In the following, we will give all the results obtained starting from feasible solutions obtained by *Adding-Node Procedure* using rule R2; however, in the experiments with the Lagrangean heuristic presented in the next section rule R1 has also been evaluated but with very unsatisfactory results.

### 3. Improving feasible solutions

Once a feasible cycle is obtained, the next step is to try to improve its objective function value.

Our first idea has been to apply a local search procedure to look for the less convenient nodes in  $V_\chi$  and substituting them for some nodes in  $VV_\chi$  having the most favorable ratio according to rule R2, thus performing the so-called X-changes on the current feasible cycle. However, experimenting with this approach we got only at most a 3.45% average improvement with respect to the solutions reported in Table 1 and that improvement was related only to about 6% of the instances.

Therefore, a different approach aimed at enlarging the solution space has been developed. Such an approach, described in the next section, has been subsequently embedded in a Lagrangean heuristic.

#### 3.1 Extension and collapse

Our idea for further improving feasible solutions for PCTSP is to explore a much wider neighbourhood of the current solution than that considered in an X-change. Then the next step is to first enlarge  $C$  and successively reduce it according to some criterion in such a way that our goal is still preserved.

In particular, for each node  $j \in VV_\chi$  the ratio between its prize and its insertion cost is evaluated according to an inserting rule similar to (2.9). This ratio is defined as the *gain* of node  $j$  and it is given by:

$$R_j = \min\{p_j / (c_{v_h j} + c_{j v_{h+1}} - c_{v_h v_{h+1}} - \gamma_j); v_h \in C\} \quad (3.1)$$

Let  $\bar{R}$  be the average gain, that is  $\bar{R} = \sum_{i \in VV_\chi} \frac{R_i}{(n-k)}$ . Then, all the nodes  $j \in VV_\chi$  such that  $R_j >$

$\bar{R}$  are possibly added to  $C$ , whereas we disregard nodes with gain less than  $\bar{R}$ . In particular, any time a node  $j$  with  $R_j > \bar{R}$  is added to  $C$  the value  $R_k$  for all  $k \in VV_\chi$  is updated taking into account the new cycle so that new nodes previously excluded from consideration can be now added to  $C$ . Value  $\bar{R}$ , instead, is not changed from one iteration to the other.

We denote this phase, in which we try to improve the overall profit of the current feasible cycle, the “*Extension phase*”.

*Figure 1* gives an example of how the original cycle is enlarged in the *Extension phase*. The average gain in the starting cycle of the digraph depicted in *Figure 1* is  $\bar{R} \approx 1.24$ , and the gain

associated with the nodes belonging to  $V \setminus V_\chi$  is, respectively,  $R_8 = 0.5$ ,  $R_9 = 2.\bar{7}$  and  $R_{10} = 0.\bar{45}$ . Therefore, in the first expansion step node 9 is added to  $C$ . After the insertion of node 9 we have a new value for the gain of node 10:  $R_{10} = 1.\bar{6} > \bar{R}$  so that also node 10 is added to  $C$ . Note that the new enlarged cycle still satisfies the knapsack constraint (1.5) since the collected prize has been increased.

In the next step of our approach we focus on the cost reduction of the cycle as it has been augmented in the previous phase, trying to remove from  $C$  the most expensive nodes. The possible cost reduction is performed as follows. We select a path  $P = (v_i, \dots, v_j)$  of  $\chi$ , with  $1 \in P$ , such that  $\sum_{h \in P} p_h < B$  and  $\sum_{h \in P} p_h + p_{v_{j+1}} \geq B$ . Then, in order to close the cycle we consider the set  $F \subseteq V \setminus P$  of nodes such that  $\sum_{h \in P} p_h + p_r \geq B \forall r \in F$ . We select node  $k \in F$  which minimizes the cost  $c_{v_j k} + c_{k v_j}$ .

Let us denote node  $k$  the “collapse point”.

The search for the collapse point is computed by the following *Collapse Procedure*:

*Procedure Collapse*( $V, A, \chi$ )

**begin**

Set initial node  $i = 1$ ;

Set Best  $\chi = \chi$ ;

**do**

**begin**

Follow the cycle from  $i$  until the feasibility is obtained (i.e. (1.5) is satisfied);

Let  $f$  be the node where the feasibility is obtained;

Go back to the predecessor  $j = b(f)$  of node  $f$ ;

Set  $P = (i, \dots, 1, \dots, j)$ ;

**if** (node 1 does not belong to  $P$ ) **then** Return(Best  $\chi$ );

Find a node  $k \in V \setminus P$  for collapsing at minimum cost while satisfying (1.5);

Let  $\bar{\chi}$  be the new collapsed cycle;

**if** cost( $\bar{\chi}$ ) < cost(Best  $\chi$ ) **then** set Best  $\chi = \bar{\chi}$ ;

Set  $i = b(i)$

**end**

**while** ( $i \neq 1$ );

Return(Best  $\chi$ )

**end.**

The second phase of our procedure is consequently denoted “*Collapse phase*”. We can see that the above *Collapse Procedure* moves backward in the cycle until node 1, representing the depot, is included. The main steps performed in the *Collapse phase* are depicted in *Figure 2*.

We execute iteratively “*Extension and Collapse Procedure*” (obtained by applying in sequence the above *Extension phase* and *Collapse Procedure*) until no further improvement is obtained. Each execution of this procedure has computational cost  $\mathbf{O}(n^2)$ .

Note that other possibilities for enlarging the cycles have been evaluated, but the consequently much higher computational time has suggested to consider only the above search step. Moreover, in order to overcome the locality of *Extension and Collapse Procedure*, different starting solutions have been generated; however, while we were able to find significant improvements for very isolated instances, the average behaviour was worst than that obtained with the lower bound procedure described in Section 2.1.



### 3.2 A Lagrangean heuristic.

Motivated by the results of the previous section, we decided to develop a Lagrangean heuristic by applying *Extension and Collapse Procedure* during the computation of the lower bound of Section 2. In this way we look for a better solution throughout *Extension and Collapse Procedure* at each step of the computation of the Lagrangean multiplier. In particular, we determine an interval  $[\lambda_1, \lambda_2]$  such that the value  $\lambda^*$ , representing the optimal value of the multiplier, belongs to this interval. Successively, we reduce it iteratively by computing the gradient in the two extremes  $\lambda_1$  and  $\lambda_2$ , then use the intersection point as the new value for one of the two extremes of the interval, determined in such a way that  $\lambda^*$  belongs to the new interval. Note that the average number of iterations required for finding  $\lambda^*$  are 4, 5 and 7 respectively for  $\alpha = 0.2, 0.5$  and  $0.8$ .

The computational results obtained when applying the Lagrangean heuristic while executing *Extension and Collapse Procedure* at each iteration of the computation of the multiplier are reported in Table 2. The computational experiments are related to the same instances specification used for Table 1 on the basis of 20 entries / value. Column headings in Table 2 are as follows. **UB/LB** gives for each value of  $\alpha$  the ratio between the present solution value, i.e our upper bound, and the lower bound; **I-Val** is the average percentage improvement of the solution values with respect to the solutions of Table 1 (in the columns related to R2), and **CPU** is the CPU time (in seconds) required for obtaining our solutions on a PC 486/66 Mhz.

n	$\alpha = 0.2$			$\alpha = 0.5$			$\alpha = 0.8$		
	UB/LB	I-Val	CPU	UB/LB	I-Val	CPU	UB/LB	I-Val	CPU
20	1.3597	24.40	0.12	1.1344	8.91	0.14	1.0617	3.11	0.17
40	1.3722	7.13	0.36	1.1317	10.19	0.51	1.1059	2.73	0.85
60	1.3241	27.58	0.41	1.1036	3.33	0.94	1.0765	0.39	1.30
80	1.2930	16.09	0.87	1.1161	1.74	1.39	1.0564	5.22	3.18
100	1.2719	10.47	3.30	1.1351	5.11	6.31	1.0519	0.90	4.80
200	1.1812	23.40	13.26	1.0535	3.34	13.00	1.0280	0.75	21.88
300	1.1051	24.54	37.73	1.0667	4.73	44.24	1.0293	3.25	70.65
400	1.2754	37.19	82.18	1.0335	1.89	79.72	1.0223	1.05	159.76
500	1.1872	31.08	131.50	1.0473	1.22	111.49	1.0210	0.50	265.83

Table 2. *Extension and Collapse Procedure* in the Lagrangean heuristic: average values.

Looking at Table 2 it can be easily noted that larger improvements of the solutions, up to 37%, are related to instances with  $\alpha = 0.2$ , while no more than a 5% improvement in the values of the solutions with respect to the feasibility phase is obtained after *Extension and Collapse Procedure* in the Lagrangean heuristic when  $\alpha = 0.8$ ; however, note that our upper bounds for  $\alpha = 0.5$  and  $0.8$  are very close to the lower bound, especially for large instances ( $n \geq 200$ ).

It is worth mentioning that the CPU time includes the running time required for computing the lower bound and the time for executing both *Adding-Nodes Procedure* and *Extension and Collapse Procedure* at each step of the computation of the Lagrangean multiplier. Note that up to  $n = 300$  all the computations are performed within one minute of CPU time, and only in one case ( $n = 500$  and  $\alpha = 0.8$ ) four minutes are required.

### 4. Further computational experiments

As a further evaluation of the goodness of our solutions, a comparison between our upper bounds and the optimal solutions of the problem under consideration has been performed. In particular, we were able to solve up to the optimality the same set of random instances of the previous sections with  $n$  ranging in  $[20, 80]$  by using the IBM Optimization Subroutine Library

(OSL) on an IBM RISC 6000 model 550. The corresponding results are reported in Table 3, where  $UB/z^*$  gives for each value of  $\alpha$  the average ratio between our upper bounds and the optimal solutions, and **Opt** is the percentage of the number of optimal solutions found executing the proposed procedures among all the instances (20 entries / value).

n	$\alpha = 0.2$		$\alpha = 0.5$		$\alpha = 0.8$	
	UB/z*	Opt	UB/z*	Opt	UB/z*	Opt
20	1.168	60	1.095	35	1.009	40
40	1.096	45	1.061	25	1.037	15
60	1.098	35	1.060	25	1.039	10
80	1.041	45	1.058	15	1.015	40

*Table 3. Comparison between our upper bounds and optimal solutions*

It can be easily noted by observing Table 3 that for  $\alpha = 0.8$  the upper bounds are very close to the optimal solutions, even if the larger number of optimal solutions found by our procedures (60%) is related to instances with  $\alpha = 0.2$

To get a more precise idea of the values of our solutions with respect to the optimal ones, *Figures 3, 4 and 5* report the average distribution of the  $UB/z^*$  values for all  $n$  and for  $\alpha = 0.2, 0.5$  and  $0.8$ , respectively. Note how the number of solutions having the  $UB/z^*$  value less than 1.1 moves from about 70% to 90% when the value of  $\alpha$ , related to the knapsack constraint, is increased.

As a further general comment we can see that generally our upper bounds are closer to the optimal solutions than to the lower bounds; in particular, in only 13% of the instances under consideration with  $n$  ranging in  $[20,80]$ , mainly for  $\alpha = 0.5$ , the lower bounds were closer to the optimal solutions than the UB values. Moreover, only once, among the 35% of the instances having this ratio greater than 1.25 in Figure 3, we got a value  $UB/z^* = 2.1459$ , that is our worst result.

The computational experiments performed until now have been made with random instances generated similarly to those already introduced and tested in the recent literature (see Fischetti and Toth (1988) and Dell'Amico, Maffioli and Värbrand (1995)). The main characteristic of such instances is to have penalties  $\gamma_i = 0 \forall i \in V$ , so we decided to investigate the influence of the penalty on the difficulty of the problem. We have hence reconsidered the same set of instances used for the computational experiments reported in Sections 2 and 3 (with  $n$  ranging from 20 up to 500, costs randomly generated from an uniform distribution in  $[0,1000]$ , prizes also randomly derived from an uniform distribution in  $[0,100]$  and  $\alpha = 0.2, 0.5$  and  $0.8$ ), and with seven different classes of values for the penalties: the first six classes have  $\gamma_i \in [1,\beta]$ ,  $\beta = (20, 50, 100, 200, 500, 1000)$  and the last class has  $\gamma_i = p_i, \forall i \in V$ .

n	$\alpha = 0.2$		$\alpha = 0.5$		$\alpha = 0.8$	
	UB/LB	Sol	UB/LB	Sol	UB/LB	Sol
20	1.1226	0	1.1693	0	1.1201	0
40	1.0532	0	1.1075	0	1.0525	0
60	1.0143	2	1.0511	0	1.0473	0
80	1.0008	9	1.0155	1	1.0367	0
100	1	20	1.0173	1	1.0213	0
200	1	20	1	20	1.0050	0
300	1	20	1	20	1.0002	1
400	1	20	1	20	1	20
500	1	20	1	20	1	20

*Table 4. Average solutions for procedure Extension and Collapse for  $\gamma_i \in [1,20]$*

In Table 4 we report the results for values of the penalties generated in  $[1,20]$ . In columns **UB/LB** we give the average ratios between the upper bounds and the lower bounds, while in columns **Sol** is reported the number of instances, over 20, in which the cycle produced by the lower bound was feasible (and hence optimal).

In this last case the problems result much easier than in the previous ones. In particular, it is possible to note that the number of instances in which the cycle determined by the lower bound is optimal increases with  $n$  and after a threshold value of  $n$  (increasing with  $\alpha$ ) all the instances are optimally solved by the lower bound procedure.

From Tables 5 and 6 we can see that when the value of  $\beta$  increases to 50 and 100, respectively, the solutions have similar behaviour than that in the case of  $\beta = 20$ , but the instances become easier and easier. In particular, all instances with  $n > 100$ ,  $\gamma_i \in [1,50]$ , and  $n > 60$ ,  $\gamma_i \in [1,100]$  (not all reported in the tables) have been solved by the lower bound procedure.

For larger values of  $\beta$  and also in the seven-th case, that is  $\gamma_i = p_i, \forall i \in V$ , all the instances were solved by the lower bound.

n	$\alpha = 0.2$		$\alpha = 0.5$		$\alpha = 0.8$	
	UB/LB	Sol	UB/LB	Sol	UB/LB	Sol
20	1.0629	8	1.0579	0	1.0753	0
40	1	20	1.0182	0	1.0341	0
60	1	20	1.0029	15	1.0199	0
80	1	20	1	20	1.0117	0
100	1	20	1	20	1.0106	0
200	1	20	1	20	1	20

*Table 5. Average solutions for procedure Extension and Collapse for  $\gamma_i \in [1,50]$*

n	$\alpha = 0.2$		$\alpha = 0.5$		$\alpha = 0.8$	
	UB/LB	Sol	UB/LB	Sol	UB/LB	Sol
20	1.0035	11	1.0184	4	1.0435	0
40	1	20	1.0182	20	1.0166	6
60	1	20	1.0029	20	1.0051	8
80	1	20	1	20	1	20

*Table 6. Average solutions for procedure Extension and Collapse for  $\gamma_i \in [1,100]$*

In order to complete our investigation on the performance of *Exstension and Collapse Procedure* in the Lagrangean heuristic we considered three sets of data derived from real applications in a steel-mill rolling problem. In particular, we considered problems with 186, 415 and 447 nodes, where the nodes belonging to  $V$  represent the jobs to be performed in a given time period. The values  $c_{ij}$  between two nodes  $i,j, \forall (i,j) \in A$ , represent the request of performing job  $j$  immediately after job  $i$ , so that the objective function is in maximization form (we transformed the problems in minimization form in order to use our procedures). The constants  $\gamma_i$  correspond to the “importance” of job  $i$ , while the constants  $p_i$  are the length of the slab to be cut by job  $i, \forall i \in V$ . A detailed description of these instances can be found in Cowling (1995).

Since the PCTSP is a simplification of a much more complex real problem, many PCTSP instances are solved with different values of  $\beta$ , trying to satisfy most of the real constraints. In our computational experiments we have solved the above three problems with nine values of  $\beta$ , determined by setting  $\alpha = (0.1, 0.2, \dots, 0.9)$ . From an analysis of the cost matrix it results that these instances are quasi-symmetric, that is most of the values  $|c_{ij} - c_{ji}|$  are close to zero. As pointed out from the authors, code CDT cannot solve this kind of instances, so we used a weaker lower bound

(see Fischetti and Toth (1988)) obtained from model (2.1)-(2.6) by removing constraints (2.5) and embedding in a Lagrangean fashion constraints (2.4). The subproblem to be solved is thus a linear assignment. In *Figures 6* and *7* we give, respectively, the CPU time (**CPU**) in seconds and the ratios (**UB/lb**) of the solutions obtained by *Extension and Collapse Procedure* over the values **lb** of the lower bound described above. The exact numerical values are reported in Table 7.

$\alpha$	n = 186		n = 415		n = 447	
	UB/lb	CPU	UB/lb	CPU	UB/lb	CPU
0.1	1.015	0.49	1.018	7.52	1.042	13.51
0.2	1.034	0.38	1.020	14.39	1.039	22.25
0.3	1.036	0.49	1.018	27.96	1.043	31.75
0.4	1.036	0.93	1.016	34.12	1.039	44.23
0.5	1.038	2.03	1.020	51.64	1.032	62.25
0.6	1.037	2.91	1.017	66.32	1.040	81.04
0.7	1.033	3.73	1.014	71.09	1.034	88.57
0.8	1.026	5.82	1.010	77.25	1.026	93.40
0.9	1.021	6.43	1.007	78.02	1.011	96.96

*Table 7. Average solutions for procedure Extension and Collapse for real applications*

We observe that the computational time required to solve the three problems greatly increases when we require to collect larger prizes (i.e. when  $\alpha$  increases), but the quality of the solutions tends to decrease. The absolute error of the heuristic solutions is always within a 4.5% from a lower bound, which confirms that our approach can be effectively applied to solve subproblems encountered during the solution of real life applications.

## Acknowledgements

The authors wish to thank Peter Cowling for his precious help in providing and validating the real life instances of the problem.

## References

- Baccus F., Cowling P., Vaessen N. & Van Neron L. (1995). Optimal rolling mill planning at Usines Gustane Boel. *Steel Times / Steel Times International*, pp.S2-S4.
- Balas E. (1989). The Prize Collecting Travelling Salesman Problem. *Networks*, Vol. 19, pp.621-636.
- Balas E. (1995). The prize collecting travelling salesman problem: II. Polyhedral results. *Networks*, Vol. 25, pp.199-216.
- Balas E. & Martin C.H. (1985). G.ROLL-A-ROUND: Software Package for Scheduling the Rounds of a Rolling Mill. Copyright Balas and Martin Associates, 104 Maple Heights Road, Pittsburgh, USA.
- Balas E. & Martin C.H. (1991). Combinatorial Optimization in Steel Rolling. Paper presented at the DIMACS/RUTCOR Workshop on Combinatorial Optimization in Science and Technology, Rutgers University, USA, April 1991.

- Carpaneto G., Dell'Amico M. & Toth P. (1995). Exact solution of large-scale asymmetric Travelling Salesman Problem. *ACM Transaction on Mathematical Software*. Vol 2, No 4, pp 394-409.
- Cowling P. (1995). Optimization in Steel Hot Rolling. *Optimization in Industry 3*, Edited by A. Sciomachen, pp. 55-66, John Wiley & Sons Ltd.
- Dell'Amico M., Maffioli F. & Värbrand P. (1995). On Prize-Collecting Tours and the Asymmetric Travelling Salesman Problem. *International Transaction on O.R.*, Vol 2, No3, pp. 297-308.
- Fischetti M. & Toth P. (1988). An additive approach for the optimal solution of the Prize Collecting Travelling Salesman Problem. In *Vehicle Routing: methods and Studies*, B.L. Golden ND .A. Assad Eds. pp.319-343, Elsevier Science Publishers B.V. (North Holland).
- Fischetti M, Salazar J.J González & Toth P. (1993). A Branch-and-Cut Algorithm for the Symmetric Generalized Travelling Salesman Problem. DEIS Research Report Bologna, Nov. 1993.
- Golden B.L., Levy L. & Vohra R. (1987). The orienteering problem. *Naval Research Logistics Quarterly*, Vol. 34, pp. 307-318.
- Golden B.L., Wang Q. & Liu L. (1988). A multifaceted heuristic for the orienteering problem. *Naval Research Logistics Quarterly*, Vol. 35, pp. 359-366.
- Laporte G. & Martello S. (1990). The selective travelling salesman problem. *Discrete Applied Mathematics*, Vol. 26, pp. 797-809.
- Volgenant T. & Jonker R. (1987). On some generalizations of the travelling salesman problem. *Journal of the Operational Research Society*, Vol. 38, pp.1073-1079.



1. Maria Cristina Marcuzzo [1985] "Yoan Violet Robinson (1903-1983)", pp. 134
2. Sergio Lugaresi [1986] "Le imposte nelle teorie del sovrappiù", pp. 26
3. Massimo D'Angelillo e Leonardo Paggi [1986] "PCI e socialdemocrazie europee. Quale riformismo?", pp. 158
4. Gian Paolo Caselli e Gabriele Pastrello [1986] "Un suggerimento hobsoniano su terziario ed occupazione: il caso degli Stati Uniti 1960/1983", pp. 52
5. Paolo Bosi e Paolo Silvestri [1986] "La distribuzione per aree disciplinari dei fondi destinati ai Dipartimenti, Istituti e Centri dell'Università di Modena: una proposta di riforma", pp. 25
6. Marco Lippi [1986] "Aggregations and Dynamic in One-Equation Econometric Models", pp. 64
7. Paolo Silvestri [1986] "Le tasse scolastiche e universitarie nella Legge Finanziaria 1986", pp. 41
8. Mario Forni [1986] "Storie familiari e storie di proprietà. Itinerari sociali nell'agricoltura italiana del dopoguerra", pp. 165
9. Sergio Paba [1986] "Gruppi strategici e concentrazione nell'industria europea degli elettrodomestici bianchi", pp. 56
10. Nerio Naldi [1986] "L'efficienza marginale del capitale nel breve periodo", pp. 54
11. Fernando Vianello [1986] "Labour Theory of Value", pp. 31
12. Piero Gantugi [1986] "Risparmio forzato e politica monetaria negli economisti italiani tra le due guerre", pp. 40
13. Maria Cristina Marcuzzo e Annalisa Rosselli [1986] "The Theory of the Gold Standard and Ricardo's Standard Comodity", pp. 30
14. Giovanni Solinas [1986] "Mercati del lavoro locali e carriere di lavoro giovanili", pp. 66
15. Giovanni Bonifati [1986] "Saggio dell'interesse e domanda effettiva. Osservazioni sul cap. 17 della General Theory", pp. 42
16. Marina Murat [1986] "Betwin old and new classical macroeconomics: notes on Lejohufvud's notion of full information equilibrium", pp. 20
17. Sebastiano Brusco e Giovanni Solinas [1986] "Mobilità occupazionale e disoccupazione in Emilia Romagna", pp. 48
18. Mario Forni [1986] "Aggregazione ed esogeneità", pp. 13
19. Sergio Lugaresi [1987] "Redistribuzione del reddito, consumi e occupazione", pp. 17
20. Fiorenzo Sperotto [1987] "L'immagine neopopulista di mercato debole nel primo dibattito sovietico sulla pianificazione", pp. 34
21. M. Cecilia Guerra [1987] "Benefici tributari nel regime misto per i dividendi proposto dalla commissione Sarcinelli: una nota critica", pp. 9
22. Leonardo Paggi [1987] "Contemporary Europe and Modern America: Theories of Modernity in Comparative Perspective", pp. 38
23. Fernando Vianello [1987] "A Critique of Professor Goodwin's 'Critique of Sraffa'", pp. 12
24. Fernando Vianello [1987] "Effective Demand and the Rate of Profits. Some Thoughts on Marx, Kalecki and Sraffa", pp. 41
25. Anna Maria Sala [1987] "Banche e territorio. Approccio ad un tema geografico-economico", pp. 40
26. Enzo Mingione e Giovanni Mottura [1987] "Fattori di trasformazione e nuovi profili sociali nell'agricoltura italiana: qualche elemento di discussione", pp. 36
27. Giovanna Procacci [1988] "The State and Social Control in Italy During the First World War", pp. 18
28. Massimo Matteuzzi e Annamaria Simonazzi [1988] "Il debito pubblico", pp. 62
29. Maria Cristina Marcuzzo (a cura di) [1988] "Richard F. Kahn. A discipline of Keynes", pp. 118
30. Paolo Bosi [1988] "MICROMOD. Un modello dell'economia italiana per la didattica della politica fiscale", pp. 34
31. Paolo Bosi [1988] "Indicatori della politica fiscale. Una rassegna e un confronto con l'aiuto di MICROMOD", pp. 25
32. Giovanna Procacci [1988] "Protesta popolare e agitazioni operaie in Italia 1915-1918", pp. 45
33. Margherita Russo [1988] "Distretto Industriale e servizi. Uno studio dei trasporti nella produzione e nella vendita delle piastrelle", pp. 157
34. Margherita Russo [1988] "The effect of technical change on skill requirements: an empirical analysis", pp. 28
35. Carlo Grillenzoni [1988] "Identification, estimations of multivariate transfer functions", pp. 33
36. Nerio Naldi [1988] "'Keynes' concept of capital", pp. 40
37. Andrea Ginzbug [1988] "locomotiva Italia?", pp. 30
38. Giovanni Mottura [1988] "La 'persistenza' secolare. Appunti su agricoltura contadina ed agricoltura familiare nelle società industriali", pp. 40
39. Giovanni Mottura [1988] "L'anticamera dell'esodo. I contadini italiani della 'restaurazione contrattuale' fascista alla riforma fondiaria", pp. 40
40. Leonardo Paggi [1988] "Americanismo e riformismo. La socialdemocrazia europea nell'economia mondiale aperta", pp. 120
41. Annamaria Simonazzi [1988] "Fenomeni di isteresi nella spiegazione degli alti tassi di interesse reale", pp. 44
42. Antonietta Bassetti [1989] "Analisi dell'andamento e della casualità della borsa valori", pp. 12
43. Giovanna Procacci [1989] "State coercion and worker solidarity in Italy (1915-1918): the moral and political content of social unrest", pp. 41
44. Carlo Alberto Magni [1989] "Reputazione e credibilità di una minaccia in un gioco bargaining", pp. 56
45. Giovanni Mottura [1989] "Agricoltura familiare e sistema agroalimentare in Italia", pp. 84
46. Mario Forni [1989] "Trend, Cycle and 'Fortuitous cancellation': a Note on a Paper by Nelson and Plosser", pp. 4
47. Paolo Bosi, Roberto Golinelli, Anna Stagni [1989] "Le origini del debito pubblico e il costo della stabilizzazione", pp. 26
48. Roberto Golinelli [1989] "Note sulla struttura e sull'impiego dei modelli macroeconomici", pp. 21
49. Marco Lippi [1989] "A Shorte Note on Cointegration and Aggregation", pp. 11
50. Gian Paolo Caselli e Gabriele Pastrello [1989] "The Linkage between Tertiary and Industrial Sector in the Italian Economy: 1951-1988. From an External Dependence to an International One", pp. 40
51. Gabriele Pastrello [1989] "Francois quesnay: dal Tableau Zig-zag al Tableau Formule: una ricostruzione", pp. 48
52. Paolo Silvestri [1989] "Il bilancio dello stato", pp. 34
53. Tim Mason [1990] "Tre seminari di storia sociale contemporanea", pp. 26
54. Michele Lalla [1990] "The Aggregate Escape Rate Analysed through the Queueing Model", pp. 23
55. Paolo Silvestri [1990] "Sull'autonomia finanziaria dell'università", pp. 11
56. Paola Bertolini, Enrico Giovannetti [1990] "Uno studio di 'filiera' nell'agroindustria. Il caso del Parmigiano Reggiano", pp. 164
57. Paolo Bosi, Roberto Golinelli, Anna Stagni [1990] "Effetti macroeconomici, settoriali e distributivi dell'armonizzazione dell'IVA", pp. 24
58. Michele Lalla [1990] "Modelling Employment Spells from Emilia Labour Force Data", pp. 18

59. Andrea Ginzburg [1990] "Politica Nazionale e commercio internazionale", pp. 22
60. Andrea Giommi [1990] "La probabilità individuale di risposta nel trattamento dei dati mancanti", pp. 13
61. Gian Paolo Caselli e Gabriele Pastrello [1990] "The service sector in planned economies. Past experiences and future prospectives", pp. 32
62. Giovanni Solinas [1990] "Competenze, grandi industrie e distretti industriali, il caso Magneti Marelli", pp. 23
63. Andrea Ginzburg [1990] "Debito pubblico, teorie monetarie e tradizione civica nell'Inghilterra del Settecento", pp. 30
64. Mario Forni [1990] "Incertezza, informazione e mercati assicurativi: una rassegna", pp. 37
65. Mario Forni [1990] "Misspecification in Dynamic Models", pp. 19
66. Gian Paolo Caselli e Gabriele Pastrello [1990] "Service Sector Growth in CPE's: An Unsolved Dilemma", pp. 28
67. Paola Bertolini [1990] "La situazione agro-alimentare nei paesi ad economia avanzata", pp. 20
68. Paola Bertolini [1990] "Sistema agro-alimentare in Emilia Romagna ed occupazione", pp. 65
69. Enrico Giovannetti [1990] "Efficienza ed innovazione: il modello "fondi e flussi" applicato ad una filiera agro-industriale", pp. 38
70. Margherita Russo [1990] "Cambiamento tecnico e distretto industriale: una verifica empirica", pp. 115
71. Margherita Russo [1990] "Distretti industriali in teoria e in pratica: una raccolta di saggi", pp. 119
72. Paolo Silvestri [1990] "La Legge Finanziaria. Voce dell'enciclopedia Europea Garzanti", pp. 8
73. Rita Paltrinieri [1990] "La popolazione italiana: problemi di oggi e di domani", pp. 57
74. Enrico Giovannetti [1990] "Illusioni ottiche negli andamenti delle Grandezze distributive: la scala mobile e l'appiattimento delle retribuzioni in una ricerca", pp. 120
75. Enrico Giovannetti [1990] "Crisi e mercato del lavoro in un distretto industriale: il bacino delle ceramiche. Sez. I", pp. 150
76. Enrico Giovannetti [1990] "Crisi e mercato del lavoro in un distretto industriale: il bacino delle ceramiche. Sez. II", pp. 145
78. Antonietta Bassetti e Costanza Torricelli [1990] "Una riqualificazione dell'approccio bargaining alla selezioni di portafoglio", pp. 4
77. Antonietta Bassetti e Costanza Torricelli [1990] "Il portafoglio ottimo come soluzione di un gioco bargaining", pp. 15
79. Mario Forni [1990] "Una nota sull'errore di aggregazione", pp. 6
80. Francesca Bergamini [1991] "Alcune considerazioni sulle soluzioni di un gioco bargaining", pp. 21
81. Michele Grillo e Michele Polo [1991] "Political Exchange and the allocation of surplus: a Model of Two-party competition", pp. 34
82. Gian Paolo Caselli e Gabriele Pastrello [1991] "The 1990 Polish Recession: a Case of Truncated Multiplier Process", pp. 26
83. Gian Paolo Caselli e Gabriele Pastrello [1991] "Polish firms: Pricate Vices Pubblis Virtues", pp. 20
84. Sebastiano Brusco e Sergio Paba [1991] "Connessioni, competenze e capacità concorrenziale nell'industria della Sardegna", pp. 25
85. Claudio Grimaldi, Rony Hamoui, Nicola Rossi [1991] "Non Marketable assets and households' Portfolio Choice: a Case of Study of Italy", pp. 38
86. Giulio Righi, Massimo Baldini, Alessandra Brambilla [1991] "Le misure degli effetti redistributivi delle imposte indirette: confronto tra modelli alternativi", pp. 47
87. Roberto Fanfani, Luca Lanini [1991] "Innovazione e servizi nello sviluppo della meccanizzazione agricola in Italia", pp. 35
88. Antonella Caiumi e Roberto Golinelli [1992] "Stima e applicazioni di un sistema di domanda Almost Ideal per l'economia italiana", pp. 34
89. Maria Cristina Marcuzzo [1992] "La relazione salari-occupazione tra rigidità reali e rigidità nominali", pp. 30
90. Mario Biagioli [1992] "Employee financial participation in enterprise results in Italy", pp. 50
91. Mario Biagioli [1992] "Wage structure, relative prices and international competitiveness", pp. 50
92. Paolo Silvestri e Giovanni Solinas [1993] "Abbandoni, esiti e carriera scolastica. Uno studio sugli studenti iscritti alla Facoltà di Economia e Commercio dell'Università di Modena nell'anno accademico 1990/1991", pp. 30
93. Gian Paolo Caselli e Luca Martinelli [1993] "Italian GPN growth 1890-1992: a unit root or segmented trend representatin?", pp. 30
94. Angela Politi [1993] "La rivoluzione fraintesa. I partigiani emiliani tra liberazione e guerra fredda, 1945-1955", pp. 55
95. Alberto Rinaldi [1993] "Lo sviluppo dell'industria metalmeccanica in provincia di Modena: 1945-1990", pp. 70
96. Paolo Emilio Mistrulli [1993] "Debito pubblico, intermediari finanziari e tassi d'interesse: il caso italiano", pp. 30
97. Barbara Pistoresi [1993] "Modelling disaggregate and aggregate labour demand equations. Cointegration analysis of a labour demand function for the Main Sectors of the Italian Economy: 1950-1990", pp. 45
98. Giovanni Bonifati [1993] "Progresso tecnico e accumulazione di conoscenza nella teoria neoclassica della crescita endogena. Una analisi critica del modello di Romer", pp. 50
99. Marcello D'Amato e Barbara Pistoresi [1994] "The relationship(s) among Wages, Prices, Unemployment and Productivity in Italy", pp. 30
100. Mario Forni [1994] "Consumption Volatility and Income Persistence in the Permanent Income Model", pp. 30
101. Barbara Pistoresi [1994] "Using a VECM to characterise the relative importance of permanent and transitory components", pp. 28
102. Gian Paolo Caselli e Gabriele Pastrello [1994] "Polish recovery form the slump to an old dilemma", pp. 20
103. Sergio Paba [1994] "Imprese visibili, accesso al mercato e organizzazione della produzione", pp. 20
104. Giovanni Bonifati [1994] "Progresso tecnico, investimenti e capacità produttiva", pp. 30
105. Giuseppe Marotta [1994] "Credit view and trade credit: evidence from Italy", pp. 20
106. Margherita Russo [1994] "Unit of investigation for local economic development policies", pp. 25
107. Luigi Brighi [1995] "Monotonicity and the demand theory of the weak axioms", pp. 20
108. Mario Forni e Lucrezia Reichlin [1995] "Modelling the impact of technological change across sectors and over time in manufacturing", pp. 25
109. Marcello D'Amato e Barbara Pistoresi [1995] "Modelling wage growth dynamics in Italy: 1960-1990", pp. 38
110. Massimo Baldini [1995] "INDIMOD. Un modello di microsimulazione per lo studio delle imposte indirette", pp. 37
111. Paolo Bosi [1995] "Regionalismo fiscale e autonomia tributaria: l'emersione di un modello di consenso", pp. 38
112. Massimo Baldini [1995] "Aggregation Factors and Aggregation Bias in Consumer Demand", pp. 33
113. Costanza Torricelli [1995] "The information in the term structure of interest rates. Can stochastic models help in resolving the puzzle?" pp. 25
114. Margherita Russo [1995] "Industrial complex, pôle de développement, distretto industriale. Alcune questioni sulle unità di indagine nell'analisi dello sviluppo." pp. 45



115. Angelika Moryson [1995] "50 Jahre Deutschland. 1945 - 1995" pp. 21
116. Paolo Bosi [1995] "Un punto di vista macroeconomico sulle caratteristiche di lungo periodo del nuovo sistema pensionistico italiano." pp. 32
117. Gian Paolo Caselli e Salvatore Curatolo [1995] "Esistono relazioni stimabili fra dimensione ed efficienza delle istituzioni e crescita produttiva? Un esercizio nello spirito di D.C. North." pp. 11
118. Mario Forni e Marco Lippi [1995] "Permanent income, heterogeneity and the error correction mechanism." pp. 21
119. Barbara Pistoresi [1995] "Co-movements and convergence in international output. A Dynamic Principal Components Analysis" pp. 14
120. Mario Forni e Lucrezia Reichlin [1995] "Dynamic common factors in large cross-section" pp. 17
121. Giuseppe Marotta [1995] "Il credito commerciale in Italia: una nota su alcuni aspetti strutturali e sulle implicazioni di politica monetaria" pp. 20
122. Giovanni Bonifati [1995] "Progresso tecnico, concorrenza e decisioni di investimento: una analisi delle determinanti di lungo periodo degli investimenti" pp. 25
123. Giovanni Bonifati [1995] "Cambiamento tecnico e crescita endogena: una valutazione critica delle ipotesi del modello di Romer" pp. 21
124. Barbara Pistoresi e Marcello D'Amato [1995] "La riservatezza del banchiere centrale è un bene o un male? Effetti dell'informazione incompleta sul benessere in un modello di politica monetaria." pp. 32
125. Barbara Pistoresi [1995] "Radici unitarie e persistenza: l'analisi univariata delle fluttuazioni economiche." pp. 33
126. Barbara Pistoresi e Marcello D'Amato [1995] "Co-movements in European real outputs" pp. 20
127. Antonio Ribba [1996] "Ciclo economico, modello lineare-stocastico, forma dello spettro delle variabili macroeconomiche" pp. 31
128. Carlo Alberto Magni [1996] "Repeatable and a tantum real options a dynamic programming approach" pp. 23
129. Carlo Alberto Magni [1996] "Opzioni reali d'investimento e interazione competitiva: programmazione dinamica stocastica in optimal stopping" pp. 26
130. Carlo Alberto Magni [1996] "Vaghezza e logica fuzzy nella valutazione di un'opzione reale" pp. 20
131. Giuseppe Marotta [1996] "Does trade credit redistribution thwart monetary policy? Evidence from Italy" pp. 20
132. Mauro Dell'Amico e Marco Trubian [1996] "Almost-optimal solution of large weighted equicut problems" pp. 30
133. Carlo Alberto Magni [1996] "Un esempio di investimento industriale con interazione competitiva e avversione al rischio" pp. 20
134. Margherita Russo, Peter Börkey, Emilio Cubel, François Lévêque, Francisco Mas [1996] "Local sustainability and competitiveness: the case of the ceramic tile industry" pp. 66
135. Margherita Russo [1996] "Camionetto tecnico e relazioni tra imprese" pp. 190
136. David Avra Lane, Irene Poli, Michele Lalla, Alberto Roverato [1996] "Lezioni di probabilità e inferenza statistica" pp. 288
137. David Avra Lane, Irene Poli, Michele Lalla, Alberto Roverato [1996] "Lezioni di probabilità e inferenza statistica - Esercizi svolti -" pp. 302
138. Barbara Pistoresi [1996] "Is an Aggregate Error Correction Model Representative of Disaggregate Behaviours? An example" pp. 24
139. Luisa Malaguti e Costanza Torricelli [1996] "Monetary policy and the term structure of interest rates", pp. 30
140. Mauro Dell'Amico, Martine Labbé, Francesco Maffioli [1996] "Exact solution of the SONET Ring Loading Problem", pp. 20
141. Mauro Dell'Amico, R.J.M. Vaessens [1996] "Flow and open shop scheduling on two machines with transportation times and machine-independent processing times in NP-hard, pp. 10

