

### The Asymmetric Traveling Salesman Problem (ATSP)

#### 1) ILP formulation with cut-set inequalities.

Let  $G = (V, E)$  be a complete directed graph, with a cost  $c_{ij} \in \mathbb{R}$  for each arc  $(i, j) \in E$ . Consider the following Integer Linear Programming formulation (Dantzig, Fulkerson, Johnson, 1959) for the ATSP:

$$(DFJ) \quad \min \quad \sum_{(i,j) \in E} c_{ij} x_{ij} \quad (1)$$

$$s.t. \quad \sum_{j \in V: j \neq i} x_{ij} = 1 \quad i \in V \quad (2)$$

$$\sum_{i \in V: i \neq j} x_{ij} = 1 \quad j \in V \quad (3)$$

$$\sum_{(i,j) \in \delta^+(S)} x_{ij} \geq 1 \quad S \subset V, 1 \in S, |S| > 1 \quad (4)$$

$$x_{ij} \in \{0, 1\} \quad (i, j) \in E, \quad (5)$$

where the constraints (4) are the *cut-set inequalities*, and its linear relaxation:

$$(DFJ^0) \quad \min \quad \sum_{(i,j) \in E} c_{ij} x_{ij} \quad (6)$$

$$s.t. \quad \sum_{j \in V: j \neq i} x_{ij} = 1 \quad i \in V \quad (7)$$

$$\sum_{i \in V: i \neq j} x_{ij} = 1 \quad j \in V \quad (8)$$

$$\sum_{(i,j) \in \delta^+(S)} x_{ij} \geq 1 \quad S \subset V, 1 \in S, |S| > 1 \quad (9)$$

$$x_{ij} \geq 0 \quad (i, j) \in E. \quad (10)$$

- a) Write with AMPL and solve the original formulation  $(DFJ)$  and its linear relaxation  $(DFJ^0)$ . A sketch of the file `.mod` is given on page 3 and following.
- b) Compare the optimal solutions of  $(DFJ)$  and  $(DFJ^0)$ . What do you observe?

## 2) Compact extended ILP formulation.

Consider the partial ILP formulation for the ATSP with only the assignment constraints:

$$\min \sum_{(i,j) \in E} c_{ij} x_{ij} \quad (11)$$

$$s.t. \sum_{j \in V: j \neq i} x_{ij} = 1 \forall i \in V \quad (12)$$

$$\sum_{i \in V: i \neq j} x_{ij} = 1 \forall j \in V \quad (13)$$

$$x_{ij} \in \{0, 1\} \quad \forall (i, j) \in A. \quad (14)$$

- c) Starting from the partial formulation (11)-(14), propose a compact extended formulation for ATSP. *Hint: add, for each  $i \in V$ , an integer variable  $t_i$  representing the "position" in which node  $i$  is visited in the tour, and an appropriate set of constraints used to avoid all possible subtours.*
- d) Explain why such additional constraints exclude any subtour.
- e) Is the integrality of variables  $t_i$  required?
- f) The extended formulation of question c) is known in the literature as Miller, Tucker, Zemlin ( $MTZ$ ) formulation. Write it in AMPL and find the solution of its linear relaxation for the given instance.
- g) Compare the linear relaxation bound obtained with ( $MTZ^0$ ) with that obtained with formulation ( $DFJ^0$ ). What do you observe? Is the solution obtained with ( $MTZ^0$ ) integer?

### Solution sketch

The file `k6_dir.dat` contains a complete graph with 6 nodes (optimal value of the objective function: 137):

```
#k6_dir.dat

data;

set V := a b c d e f;

param c:  a   b   c   d   e   f   :=
    a   .   03  05  100  88  55
    b   02   .   04  69  75  55
    c   04   03   .  100  99  85
    d   99   68  99   .   03  04
    e   87   74  98   02   .   05
    f   54   54  84   03   04   .
;
```

The file `dfj-i.mod` contains the partial model for formulation (DFJ), to be completed:

```
#dfj-i.mod

set V ordered;
param n := card {V};

set POWERSET := 0 .. (2**n - 1);

set S {k in POWERSET} := {i in V: (k div 2**(ord(i)-1)) mod 2 = 1};

set E := {i in V, j in V: ord(i) <> ord(j)};

#add parameters declarations

#add variables declarations

#add model
```

**Observation:** a generic subset  $S \subseteq V$  can be represented as a vector of  $n = |V|$  bits with value in  $\{0, 1\}$ , where position  $i$  has value 1 if the node  $i$  belongs to  $S$ , and 0 otherwise. Then the representation in base-2 of the integers between 0 and  $2^n - 1$  gives all possible bit vectors of length  $n$ . Then, to build all possible subsets  $S$  of  $V$ , let

$$\text{set POWERSET} := 0 \dots (2^{**}n - 1);$$

the set of indices from 0 to  $2^n - 1$ . We define the  $k$ -th subsets  $S[k]$  with the binary representation of  $k$ :  $S[k]$  contains the nodes whose corresponding bit is equal to 1. In base-2, the  $i$ -th figure of  $k_2$  is equal to 1 if and only if

$$(k \text{ div } 2^{**}(\text{ord}(i)-1)) \bmod 2 = 1$$

then we can write all possible (exponentially many!) subsets as follows:

$$\text{set S \{k in POWERSET\} := \{i in V: (k div 2^{**}(\text{ord}(i)-1)) mod 2 = 1\};$$

The model can be solved running the file `dfj.run`:

```
model dfj.mod
data k6_dir.dat
option solver cplex;

solve;
display x;

printf "Linear relaxation\n\n";
option relax_integrality 1;

solve;
display x;
```

The file `MTZ-i.mod` contains the partial model of formulation (MTZ):

```
# SETS

set V ordered;

set V_reduced := {i in V : ord(i) > 1};

param n := card(V);

set E := {i in V, j in V: ord(i) <> ord(j)};

# PARAMETERS

# VARIABLES

# OBJECTIVE FUNCTION

# CONSTRAINTS
```

The model can be solved running the file `MTZ.run`:

```
model MTZ.mod
data k6_dir.dat
option solver cplex;

solve;
display x;
display t;

option relax_integrality 1;
solve;
display x;
display t;
```