

# The Periodic Rural Postman Problem with Irregular Services on Mixed Graphs

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# Outline

- 1 Background
- 2 A Mathematical Formulation
- 3 Valid Inequalities
- 4 A Branch-and-Cut Algorithm
- 5 Computational Experiments
- 6 Conclusions

# Preliminary Issues

The aim of the **Routing Problems** is to design a number of vehicle routes that visit a given set of customers in order to service them.

In the **Periodic Routing Problems**:

- the service occurs in some **periods (days)** of a given **time horizon**. Each customer has to be serviced in different days, frequency, ...
- usually the customers are identified as nodes of a graph representing the streets network (**Periodic Vehicle Routing Problems**); when the requirement of service can be identified with the arcs or edges of the graph, we talk about **Periodic Arc Routing Problems**.

# Scientific Literature: Some Pertinent Works

⇒ **Periodic Vehicle Routing Problem:** It has been studied extensively!

- A.M. Campbell and J.H. Wilson, Forty years of periodic vehicle routing, *Networks* 63 (2014), 2–15.

⇒ **Periodic Arc Routing Problem:** The literature is still scarce!

- G. Ghiani, R. Musmanno, G. Paletta, and C. Triki, A heuristic for the periodic rural postman problem, *Computers & Operations Research* 32 (2005) 219–228.
- F. Chu, N. Labadi, and C. Prins, A Scatter Search for the periodic capacitated arc routing problem, *European Journal of Operational Research* 169 (2006), 586–605.
- P. Lacomme, C. Prins, and W. Ramdane-Chérif, Evolutionary algorithms for periodic arc routing problems, *European Journal of Operational Research* 165 (2005), 535–553.
- I.M. Monroy, C.A. Amaya, and A. Langevin, The periodic capacitated arc routing problem with irregular services, *Discrete Applied Mathematics* 161 (2013), 691–701.

The Periodic Rural Postman Problem with Irregular Services (PRPP-IS) belongs to the class of Periodic Arc Routing Problems. To the best of our knowledge, it has not yet been studied.

# Problem Description

## PRPP-IS:

- There is a **single vehicle** (no capacity restriction).  
A route has to be designed for each day of the time horizon in order to meet the service requirements.
- The required elements correspond to links of a graph  $G = (V, E, A)$ . In particular,  $E_R \subseteq E$  is the set of the **required edges**,  $A_R \subseteq A$  the set of **required arcs**.  $L_R = A_R \cup E_R$  denotes the set of required links. Vertex  $1 \in V$  represents the **depot**.
- Every required link has its own service plan that identifies the number of visits needed in **sub-periods** of the time-horizon. This number is called **frequency**.  
The service requirements can be **irregular** (different sizes of the sub-periods, different frequencies, etc.).
- The goal is to **minimize the total cost** over the time horizon.

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## A simple example

- ⇒ Horizon includes **7 days** (a week): **7 routes** to be constructed
- ⇒ All links are required ( $L_R = A \cup E$ ). The costs of traversing/servicing the links are not shown.
- ⇒ There are **5 sub-periods** (i.e., subsets of the time horizon):

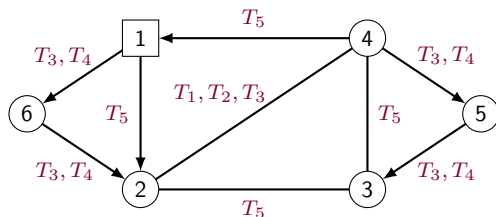
$$T_1 = \{Mon, Tue\},$$

$$T_2 = \{Wed, Thu\},$$

$$T_3 = \{Fri, Sat, Sun\},$$

$$T_4 = \{Mon, Tue, Wed, Thu\},$$

$$T_5 = \{Mon, Tue, Wed, Thu, Fri, Sat, Sun\}.$$



# A simple example

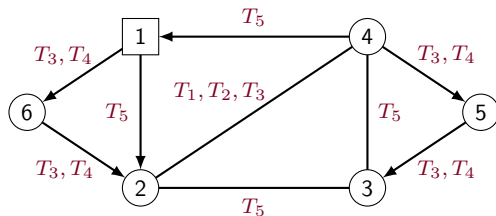
$T_1 = \{Mon, Tue\},$

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$T_5 = \{Mon, Tue, Wed, Thu, Fri, Sat, Sun\}.$



If we assume that the **frequencies** for each sub-period and for each link are equal to **1**, then:

edge (2,4) must be serviced once over the first sub-period (i.e., Monday and Tuesday), once over the second sub-period (i.e., Wednesday and Thursday), once over the third sub-period (i.e., Friday, Saturday, and Sunday), and so on for the other links.

# Applications

The PRPP-IS is a natural extension of the **rural postman problem** when a single route must be planned not just for a day, but for a set of days. Typically, the required elements correspond to streets and do not require to be serviced every day. There are various applications: **waste collection**, **inspection of electric power lines**, **mowing vegetation on roads**, etc.

⇒ The assumption of **irregularity** makes the problem more general!

## Specific Example: Monitoring Activities

Monroy, Amaya, and Langevin (2013)

Road network monitoring is carried out periodically. Each road has different surveillance requirements (number of passages) during sub-periods over the time horizon.



## Parameters

- $H$ : finite and discrete time horizon; it is a set of days;
- $P_l$ : set of disjoint sub-periods for required link  $l$  (a sub-period is a subset of  $H$ );
- $f_T^l$ : frequency, i.e. number of services needed in sub-period  $T \in P_l$  by link  $l$  ( $f_T^l \leq |T| \rightarrow$  at most one visit per day);
- $c_l = c_{ij}$ : traversal cost of link  $l = (i, j)$ ;
- $c_l^s = c_{ij}^s$ : service cost of required link  $l = (i, j)$ , with  $c_{ij}^s \geq c_{ij}$ ;
- $K$ : set of all route indices (since a route index corresponds to a day, and vice versa, a sub-period  $T$  can also denote a subset of  $K$ ).

## Decision Variables

- $x_l^k = x_{ij}^k$ : number of times that link  $l = (i, j)$  is traversed in route  $k$  from  $i$  to  $j$ ;
- $y_l^k$ : binary variable that takes value 1 if link  $l$  is serviced in route  $k$ , and value 0 otherwise.

## Additional Notation

- $A(S : S')$ : set of arcs from  $S \subset V$  to  $S' \subset V$ ;
- $E(S : S')$ : set of edges between  $S \subset V$  and  $S' \subset V$ ;
- $(S : S') = E(S : S') \cup A(S : S') \cup A(S' : S)$ ;
- $A^+(S) = A(S : V \setminus S)$ ;
- $A^-(S) = A(V \setminus S : S)$ ;
- $A(S) = A^+(S) \cup A^-(S)$ ;
- $E(S) = E(S : V \setminus S)$ ;
- $\delta(S) = E(S) \cup A(S)$  (**cutset**);
- $\gamma(S)$ : set of links with both endpoints in  $S \subset V$ .

These sets are defined in a similar way with respect only to the required links (**subscript  $R$** ):  $A_R^+(S)$ ,  $\delta_R(S)$ , etc.

In addition,  $S = \{i\}$  is represented by simply  $i$ .

# Mathematical Formulation

$$\text{Min} \sum_{k \in K} \sum_{l \in L_R} (c_l^s - c_l) y_l^k + \sum_{k \in K} \sum_{(i,j) \in E} c_{ij} (x_{ij}^k + x_{ji}^k) + \sum_{k \in K} \sum_{(i,j) \in A} c_{ij} x_{ij}^k \quad (1)$$

$$\sum_{(i,j) \in A^+(i)} x_{ij}^k + \sum_{j:(i,j) \in E(i)} x_{ij}^k = \sum_{(j,i) \in A^-(i)} x_{ji}^k + \sum_{j:(i,j) \in E(i)} x_{ji}^k \quad \forall i \in V, \forall k \in K, \quad (2)$$

$$\sum_{(i,j) \in A^-(S)} x_{ij}^k + \sum_{(i,j) \in E:i \in V \setminus S, j \in S} x_{ij}^k \geq y_l^k \quad \forall S \subseteq V \setminus \{1\}, \forall l \in \gamma_R(S), \forall k \in K \quad (3)$$

$$x_{ij}^k \geq y_{ij}^k \quad \forall (i,j) \in A_R, \forall k \in K \quad (4)$$

$$x_{ij}^k + x_{ji}^k \geq y_{ij}^k \quad \forall (i,j) \in E_R, \forall k \in K \quad (5)$$

$$\sum_{k \in T} y_l^k = f_T^l \quad \forall l \in L_R, \forall T \in P_l \quad (6)$$

$$y_l^k \in \{0, 1\} \quad \forall l \in L_R, \forall k \in K \quad (7)$$

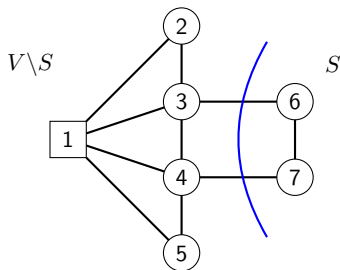
$$x_{ij}^k \geq 0 \text{ and integer} \quad \forall (i,j) \in A, \forall k \in K \quad (8)$$

$$x_{ij}^k, x_{ji}^k \geq 0 \text{ and integer} \quad \forall (i,j) \in E, \forall k \in K. \quad (9)$$

## Connectivity Constraints (3)

For  $k = 1$ ;  $S = \{6, 7\}$ ;  $l = (6, 7) \in \gamma_R(S)$ :

$$\sum_{(i,j) \in A^-(S)} x_{ij}^1 + \sum_{(i,j) \in E: i \in V \setminus S, j \in S} x_{ij}^1 \geq y_l^1$$



$$x_{36}^1 + x_{47}^1 \geq y_{67}^1$$

If the route associated with day 1 does not service edge  $(6,7)$ , then  $y_{67}^1 = 0$  and the inequality is trivially satisfied; otherwise:  $x_{36}^1 + x_{47}^1 \geq 1$ .

# Valid Inequalities

We propose several valid inequalities for the PRPP-IS . They are used to strengthen the linear relaxation. Let  $S \subset V$  be a vertex subset and  $\delta(S)$  a link cutset.

We consider:  $x^k(\delta(S)) = \sum_{(i,j) \in \delta(S) \cap A} x_{ij}^k + \sum_{(i,j) \in \delta(S) \cap E} (x_{ij}^k + x_{ji}^k)$ .

## Sub-Period Aggregate Parity Inequalities

Let  $T$  be a sub-period and  $\delta_R(S)$  a required link cutset such that  $f(\delta_R(S), T) = \sum_{l \in \delta_R(S): T \in P_l} f_T^l$  is odd:

$$\sum_{k \in T} x^k(\delta(S)) \geq f(\delta_R(S), T) + 1. \quad (10)$$



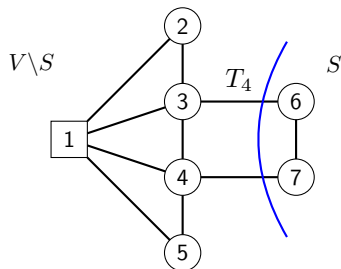
# Valid Inequalities

## Sub-Period Aggregate Parity Inequalities

For  $T = T_4 = \{Mon, Tue, Wed, Thu\}$ ;  $S = \{6, 7\}$ ;

$(3, 6) \in \delta_R(S)$  and  $f_{T_4}^{(3,6)} = 3 \rightarrow \text{odd}$ :

$$\begin{aligned} & x_{36}^1 + x_{63}^1 + x_{47}^1 + x_{74}^1 + x_{36}^2 + x_{63}^2 + x_{47}^2 + x_{74}^2 + \\ & + x_{36}^3 + x_{63}^3 + x_{47}^3 + x_{74}^3 + x_{36}^4 + x_{63}^4 + x_{47}^4 + x_{74}^4 \geq 3 + 1 \end{aligned}$$



# Valid Inequalities

## Disaggregate Parity Inequalities

Let  $F$  be a subset of  $\delta_R(S)$  such that  $|F|$  is odd:

$$x^k(\delta(S)) \geq 2y^k(F) - |F| + 1, \quad (11)$$

where  $y^k(F) = \sum_{l \in F} y_l^k$ .

## $P$ -Aggregate Parity Inequalities

In addition, let  $\bar{K} = \{k_1, k_2, \dots, k_P\}$  be a subset of  $P < |K|$  routes such that  $\bar{f}(F, \bar{K}) = \sum_{l \in F} \sum_{T \in P_l} \min(f_T^l, |T \cap \bar{K}|)$  is odd:

$$\sum_{k \in \bar{K}} x^k(\delta(S)) \geq 2 \sum_{k \in \bar{K}} y^k(F) - \bar{f}(F, \bar{K}) + 1, \quad (12)$$

For  $\bar{K} = \{Mon, Tue, Sat, Sun\}$  and  $F = \{(3, 6)\}$  with

$P_{(3,6)} = \{T_4 = \{Mon, Tue, Wed, Thu\}; T_3 = \{Fri, Sat, Sun\}\}$ ,  $f_{T_4}^{(3,6)} = 3$  and  $f_{T_3}^{(3,6)} = 1$ :

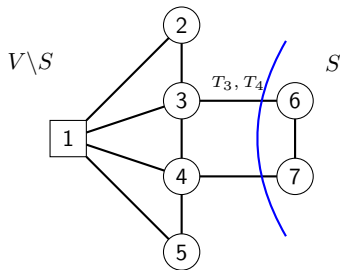
$\bar{f}(F, \bar{K}) = \min(f_{T_4}^{(3,6)}, |T_4 \cap \bar{K}|) + \min(f_{T_3}^{(3,6)}, |T_3 \cap \bar{K}|) = 2 + 1.$

# Valid Inequalities

## $P$ -Aggregate Parity Inequalities

For  $S = \{6, 7\}$ ,  $\bar{K} = \{Mon, Tue, Sat, Sun\}$  and  $F = \{(3, 6)\}$  with  $P_{(3,6)} = \{T_4 = \{Mon, Tue, Wed, Thu\}; T_3 = \{Fri, Sat, Sun\}\}$ ,  $f_{T_4}^{(3,6)} = 3$  and  $f_{T_3}^{(3,6)} = 1$ :  $\bar{f}(F, \bar{K}) = \min(f_{T_4}^{(3,6)}, |T_4 \cap \bar{K}|) + \min(f_{T_3}^{(3,6)}, |T_3 \cap \bar{K}|) = 2 + 1$ .

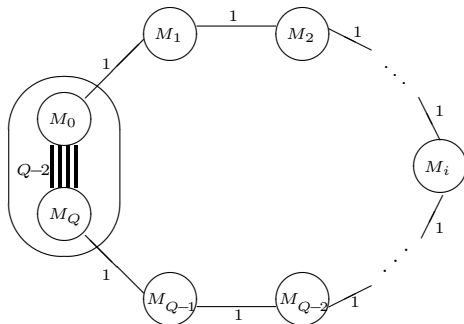
$$\sum_{k \in \bar{K}} x^k (\delta(S)) \geq 2 \sum_{k \in \bar{K}} y^k (F) - 3 + 1$$



# Valid Inequalities

## *K-C* Inequalities

They refer to a partition of  $V$  into  $\{M_0, M_1, \dots, M_Q\}$  such that each subset of vertices associated with the connected components induced by the required links (R-set) is contained in one of the sets  $M_0 \cup M_Q, M_1, \dots, M_{Q-1}$ , each  $M_i$  contains at least one R-set, the induced subgraphs  $G(M_i)$  are connected, and  $(M_0 : M_Q)$  contains a positive and even number of required links.



$$\Rightarrow \text{Set } F(x^k) = \sum_{(i,j) \in A} a_{ij} x_{ij}^k + \sum_{(i,j) \in E} (a_{ij} x_{ij}^k + a_{ji} x_{ji}^k).$$

## Disaggregate $K$ - $C$ Inequalities

Let  $\{M_0, M_1, M_2, \dots, M_{Q-1}, M_Q\}$  be a partition of  $V$  where each subgraph  $G(M_i)$  is connected. We assume that there is a required link subset  $D \subseteq (M_0: M_Q)_R$  such that  $|D|$  is positive and even and another required subset  $Z = \{l_1, l_2, \dots, l_{Q-1}\} \subset L_R$  such that each  $l_i \in \gamma_R(M_i)$ .

If  $1 \in M_0 \cup M_Q$ :

$$F(x^k) \geq 2y^k(Z) + (Q-2)(2y^k(D) - |D|). \quad (13)$$

If  $1 \in M_i$  with  $i \notin \{0, Q\}$ :

$$F(x^k) \geq 2 + 2y^k(Z) + (Q-2)(2y^k(D) - |D|). \quad (14)$$

# Valid Inequalities

## Sub-period aggregate $K-C$ Inequalities

Assume that  $\{M_0, M_1, M_2, \dots, M_{Q-1}, M_Q\}$  is a partition of  $V$ , and let  $D \subseteq (M_0 : M_Q)_R$  and  $Z = \{l_1, l_2, \dots, l_{Q-1}\} \subset L_R$ , with  $l_i \in \gamma_R(M_i)$ , such that all the links in  $D \cup Z$  have to be serviced at least once in sub-period  $T$ , i.e.  $T \in P_l$  and  $f_T^l > 0$ , for all  $l \in D \cup Z$ . Consider  $l_{i^*} \in \gamma_R(M_{i^*})$  such that  $f_T^{l_{i^*}} = \max\{f_T^{l_j} : l_j \in Z\}$  and assume that the depot is located in  $M_0 \cup M_Q$ .

If  $f_T^{l_{i^*}} = 1$ :

$$\sum_{k \in T} F(x^k) \geq 2(Q-1) + (Q-2)f(D, T), \quad (15)$$

where  $f(D, T) (= \sum_{l \in D: T \in P_l} f_T^l)$  has to be an even number.

If  $f_T^{l_{i^*}} \geq 2$ :

$$\sum_{k \in T} F(x^k) \geq 2(Q-1) + 2 + 2(f_T^{l_{i^*}} - 2)d(M_0 \cup M_Q, M_{i^*}) + (Q-2)f(D, T), \quad (16)$$

where  $d(M_0 \cup M_Q, M_{i^*}) = \min\{i^*, Q - i^*\}$ , and  $f(D, T)$  has to be an even number.

## Sub-period aggregate $K$ - $C$ Inequalities

If the depot is located in  $M_r$ , then  $r \notin \{0, Q\}$ , we choose the link  $l_{i^*} \in \gamma(M_{i^*})$ ,  $i^* \notin \{0, Q, r\}$ , as the one satisfying  $f_T^{l_{i^*}} = \max\{f_T^{l_j} : l_j \in \gamma(M_j), j \neq r\}$ .

If  $f_T^{l_{i^*}} \geq 2$ :

$$\sum_{k \in T} F(x^k) \geq 2(Q-1) + 2 + 2(f_T^{l_{i^*}} - 2)d(M_r, M_{i^*}) + (Q-2)f(D, T), \quad (17)$$

where  $d(M_r, M_{i^*}) = \min\{|r - i^*|, r + Q - i^*, i^* + Q - r\}$ , and  $f(D, T)$  has to be an even number.

## Proposition

*Sub-period aggregate  $K$ - $C$  inequalities (15), (16), and (17) are valid for the PRPP-IS if  $f(D, T)$  is an even number.*

# A Branch-and-Cut Algorithm: Simplified Outline

- Step 0.** Let  $LB = 0$  be the lower bound and  $UB = +\infty$  the upper bound.  
(Note: the value of  $LB$  is opportunistically updated during the search)
- Step 1.** Define a relaxed problem by eliminating connectivity constraints (3) and integer conditions and insert it into a list  $\Theta$  (first problem in the list).
- Step 2.** If  $\Theta$  is empty or  $LB = UB$ , then STOP. Otherwise, extract a problem from  $\Theta$ .
- Step 3.** Solve the current problem. Let  $OBJ$  be the solution value. If  $OBJ \geq UB$  then go to Step 2.
- Step 4.** Identify inequalities (3) and other valid inequalities for the PRPP-IS by using adequate separation procedures.
- Step 5.** If some violated inequalities have been identified, add these inequalities to the problem and go back to Step 3. Otherwise, if the current solution is feasible, set  $UB = OBJ$  and go back to Step 2.
- Step 6.** If the current solution is not integer, generate two subproblems by branching on a fractional variable. Insert the subproblems into  $\Theta$  and go back to Step 2.



# Separation Procedures

Some inequalities are separated at each node of the search tree. Other valid inequalities are separated at the root node solely.

- **Connectivity Constraints:** exact and heuristic procedures described by Benavent, Corberán, Plana, and Sanchis (2009) for the Min-Max  $K$ -vehicles Windy Rural Postman Problem.
- **Sub-period aggregate parity inequalities:** heuristic procedure commonly used in the literature for the separation of the aggregate parity inequalities.
- **Disaggregate and  $P$ -Aggregate Parity Inequalities:** heuristic procedure described by Ghiani and Laporte (2000) for the Undirected Rural Postman Problem.
- **Disaggregate and Sub-Period Aggregate  $K-C$  Inequalities:** three-phase heuristic procedure inspired by the one introduced by Corberán, Letchford, and Sanchis (2001) for the General Routing Problem.

# Computational Experiments

## Instances

Instances derived from `mval` datasets designed for the *Mixed Capacitated Arc Routing Problem* by Belenguer, Benavent, Lacomme and Prins (2006).

- `pcp-mval` (periodic Chinese postman): the nature of the `mval` instances has been kept, i.e., all links of the graph are required. For each required link  $l$ , a set  $P_l$  of sub-periods has been generated. The number of times that required link  $l$  must be serviced in each sub-period  $T \in P_l$  was uniformly generated in  $[1, \dots, \lceil |T|/2 \rceil]$ .  
Horizon = 7 days. 5 different sub-periods. 1 - 3 sub-periods assigned to each link
- `spcp-mval` (simplified periodic Chinese postman): `pcp-mval` instances have been simplified by "switching off" two sub-periods (i.e., by setting to zero the frequencies concerning these sub-periods).
- `prp-mval` (periodic rural postman): `pcp-mval` instances have been transformed into periodic rural postman instances by declaring some links as non-required.
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## Instances

Instances derived from `mval` datasets designed for the *Mixed Capacitated Arc Routing Problem* by Belenguer, Benavent, Lacomme and Prins (2006).

- `pcp-mval` (periodic Chinese postman): the nature of the `mval` instances has been kept, i.e., all links of the graph are required. For each required link  $l$ , a set  $P_l$  of sub-periods has been generated. The number of times that required link  $l$  must be serviced in each sub-period  $T \in P_l$  was uniformly generated in  $[1, \dots, \lceil |T|/2 \rceil]$ .  
Horizon = 7 days. 5 different sub-periods. 1 - 3 sub-periods assigned to each link
- `spcp-mval` (simplified periodic Chinese postman): `pcp-mval` instances have been simplified by “switching off” two sub-periods (i.e., by setting to zero the frequencies concerning these sub-periods).
- `prp-mval` (periodic rural postman): `pcp-mval` instances have been transformed into periodic rural postman instances by declaring some links as non-required.
- `sprp-mval` (simplified periodic rural postman): `prp-mval` instances have been simplified by “switching off” two sub-periods.

# Computational Experiments

## Workstation and Software

- Intel(R)Core(TM) i7-3630QM CPU running at 2.40 GHz; 32 GB of memory.
- C++ for Linux and ILOG CPLEX Library 12.6.

## Column Headings

FILE	instance name
$ V ,  A ,  E $	number of vertices, arcs and edges
$ A_R ,  E_R $	number of required arcs and edges
LB, UB	final lower bound and upper bound
GAP	percentage gap (from CPLEX)
SEC	computation time in seconds (TL: time limit $\rightarrow$ 6 hours)
CON	number of connectivity inequalities
DIP,SAP,PAP	number of disaggregate, sub-period aggregate and $P$ -aggregate parity inequalities
DKC,SKC	number of disaggregate and sub-period aggregate K-C inequalities
NOD	number of nodes processed in the search (apart from the root)

# Numerical Results: pcp-mval dataset

FILE	Instance Features					Main Results				Other Results						
	V	A	E	A <sub>R</sub>	E <sub>R</sub>	LB	UB	GAP	SEC	CON	DIP	SAP	PAP	DKC	SKC	NOD
pcp-mval1A	24	35	20	35	20	546.5	556	1.71	TL	3072	315	26	563	346	1	7601
pcp-mval1B	24	38	13	38	13	692	692*	0.00	112.21	51	14	3	65	0	0	0
pcp-mval1C	24	36	17	36	17	636	639	0.47	TL	1615	179	22	324	163	0	11072
pcp-mval2A	24	28	16	28	16	818	818*	0.00	99.77	223	49	7	107	3	0	0
pcp-mval2B	24	40	12	40	12	868	868*	0.00	374.53	519	181	14	321	44	0	42
pcp-mval2C	24	35	14	35	14	774.533	776	0.19	TL	1947	177	15	344	285	0	17115
pcp-mval3A	24	33	15	33	15	297	297*	0.00	7139.65	911	25	10	63	82	0	7847
pcp-mval3B	24	29	16	29	16	355	355*	0.00	434.03	522	124	11	259	36	0	54
pcp-mval3C	24	25	18	25	18	225.519	229	1.52	TL	638	190	17	359	68	0	15678
pcp-mval4A	41	69	26	69	26	1433.842	1476	2.86	TL	2924	145	15	280	231	0	2656
pcp-mval4B	41	83	19	83	19	1472.429	1481	0.58	TL	1445	136	6	174	116	0	443
pcp-mval4C	41	82	21	82	21	1503.586	1528	1.60	TL	3754	288	11	483	273	0	2622
pcp-mval4D	41	83	21	83	21	1576	1590	0.88	TL	2815	238	13	375	261	0	2563
pcp-mval5A	34	74	22	74	22	1454	1484	2.02	TL	3222	291	10	499	248	0	3394
pcp-mval5B	34	56	35	56	35	1387.784	1441	3.69	TL	7683	323	28	761	413	0	2635
pcp-mval5C	34	81	17	81	17	1697	1699	0.12	TL	1917	30	5	63	71	0	3910
pcp-mval5D	34	63	29	63	29	1439.562	1449	0.65	TL	4068	278	13	562	389	0	2446
pcp-mval6A	31	47	22	47	22	770	770*	0.00	519.59	330	194	12	297	9	0	10
pcp-mval6B	31	44	22	44	22	792	794	0.25	TL	1529	338	7	419	124	0	7806
pcp-mval6C	31	45	23	45	23	778	778*	0.00	14224.47	2364	183	8	306	224	0	1540
pcp-mval7A	40	50	36	50	36	932	942	1.06	TL	2712	193	28	571	78	0	3877
pcp-mval7B	40	66	25	66	25	1084	1087	0.28	TL	2568	75	13	187	76	0	3384
pcp-mval7C	40	62	28	62	28	964.095	975	1.12	TL	3121	124	23	342	467	0	3786
pcp-mval8A	30	76	20	76	20	1428	1439	0.76	TL	1691	312	10	463	143	0	3478
pcp-mval8B	30	64	27	64	27	1320	1345	1.86	TL	2730	453	11	647	164	0	3610
pcp-mval8C	30	55	28	55	28	1333	1336	0.23	TL	1658	233	19	447	76	0	5400
pcp-mval9A	50	100	32	100	32	1147	1156	0.78	TL	4893	322	7	468	271	0	1580
pcp-mval9B	50	76	44	76	44	1059.875	1074	1.32	TL	2403	210	27	689	94	0	1816
pcp-mval9C	50	83	42	83	42	1032	1053	1.99	TL	4115	263	31	619	207	0	1179
pcp-mval9D	50	93	38	93	38	1139	1163	2.06	TL	3560	301	23	569	277	2	1425
pcp-mval10A	50	106	32	106	32	1611	1626	0.92	TL	3450	322	23	550	69	0	1370
pcp-mval10B	50	101	33	101	33	1597.25	1638	2.49	TL	2899	288	22	488	62	0	1659
pcp-mval10C	50	100	36	100	36	1494	1542	3.11	TL	6206	286	24	668	462	0	780
pcp-mval10D	50	87	42	87	42	1368	1410	2.98	TL	4540	261	30	581	241	0	1609
average gap %									1.10							
maximum gap %									3.69							
# optima									7							

# Numerical Results: spcp-mval dataset

FILE	Instance Features					Main Results				Other Results						
	V	A	E	A <sub>R</sub>	E <sub>R</sub>	LB	UB	GAP	SEC	CON	DIP	SAP	PAP	DKC	SKC	NOD
spcp-mval1A	24	35	20	35	20	443	448	1.12	TL	3536	182	20	522	601	1	8101
spcp-mval1B	24	38	13	38	13	447	447*	0.00	56.38	93	21	2	129	0	0	0
spcp-mval1C	24	36	17	36	17	510	510*	0.00	131.77	298	61	7	233	8	0	28
spcp-mval2A	24	28	16	28	16	652	652*	0.00	157.55	260	60	6	140	8	0	8
spcp-mval2B	24	40	12	40	12	693	693*	0.00	261.15	424	54	5	174	23	0	84
spcp-mval2C	24	35	14	35	14	647	647*	0.00	124.81	364	57	10	210	18	2	22
spcp-mval3A	24	33	15	33	15	249	249*	0.00	200.15	317	57	5	138	19	0	27
spcp-mval3B	24	29	16	29	16	263	263*	0.00	548.48	371	60	4	304	11	0	136
spcp-mval3C	24	25	18	25	18	184	184*	0.00	5774.56	582	141	7	391	99	1	7399
spcp-mval4A	41	69	26	69	26	1117	1126	0.80	TL	1999	124	7	288	218	0	3186
spcp-mval4B	41	83	19	83	19	1256	1261	0.40	TL	2333	89	5	236	237	0	2692
spcp-mval4C	41	82	21	82	21	1177.497	1190	1.05	TL	3770	145	5	342	296	0	2460
spcp-mval4D	41	83	21	83	21	1163	1165	0.17	TL	1970	54	3	147	168	0	4924
spcp-mval5A	34	74	22	74	22	1160	1161	0.09	TL	2895	90	2	209	150	0	1973
spcp-mval5B	34	56	35	56	35	1074.03	1109	3.15	TL	5090	197	12	756	117	0	4028
spcp-mval5C	34	81	17	81	17	1281	1285	0.31	TL	2525	35	6	77	63	0	3398
spcp-mval5D	34	63	29	63	29	1021.5	1053	2.99	TL	3595	243	13	616	250	0	1064
spcp-mval6A	31	47	22	47	22	624	634	1.58	TL	1505	124	9	321	135	0	2752
spcp-mval6B	31	44	22	44	22	566	566*	0.00	15483.68	987	116	6	476	80	0	9719
spcp-mval6C	31	45	23	45	23	629	629*	0.00	9306.72	222	59	6	186	19	0	4
spcp-mval7A	40	50	36	50	36	756	757	0.13	TL	1509	110	11	511	34	1	4390
spcp-mval7B	40	66	25	66	25	872	872*	0.00	11818.95	1638	77	3	226	68	0	1095
spcp-mval7C	40	62	28	62	28	797	798	0.13	TL	1713	138	9	330	156	1	7180
spcp-mval8A	30	76	20	76	20	1139.5	1149	0.83	TL	2262	92	3	173	84	0	2162
spcp-mval8B	30	64	27	64	27	1121	1136	1.32	TL	2899	269	12	540	146	0	862
spcp-mval8C	30	55	28	55	28	982	992	1.01	TL	2368	124	9	532	149	0	2513
spcp-mval9A	50	100	32	100	32	967	967*	0.00	1543.96	930	166	3	328	64	0	31
spcp-mval9B	50	76	44	76	44	842.833	860	2.00	TL	3293	191	14	751	140	0	736
spcp-mval9C	50	83	42	83	42	836	842	0.71	TL	2456	182	10	631	153	0	771
spcp-mval9D	50	93	38	93	38	830.636	842	1.35	TL	7456	150	14	482	286	0	1380
spcp-mval10A	50	106	32	106	32	1238	1268	2.37	TL	2549	128	5	278	158	0	514
spcp-mval10B	50	101	33	101	33	1195.233	1214	1.55	TL	6800	132	12	453	528	0	898
spcp-mval10C	50	100	36	100	36	1094.577	1130	3.14	TL	4212	166	12	505	492	0	278
spcp-mval10D	50	87	42	87	42	1129	1146	1.48	TL	3316	178	12	433	260	0	1450
average gap %									0.81							
maximum gap %									3.15							
# optima									12							



# Numerical Results: prp-mval dataset

FILE	Instance Features					Main Results				Other Results						
	V	A	E	A <sub>R</sub>	E <sub>R</sub>	LB	UB	GAP	SEC	CON	DIP	SAP	PAP	DKC	SKC	NOD
prp-mval1A	24	35	20	21	13	380	380*	0.00	1381.38	403	65	10	156	54	1	1514
prp-mval1B	24	38	13	25	9	564	564*	0.00	37.80	98	12	2	20	0	0	0
prp-mval1C	24	36	17	23	10	506	508	0.39	TL	699	30	7	87	27	0	32602
prp-mval2A	24	28	16	14	10	634	634*	0.00	171.36	345	17	3	47	2	0	210
prp-mval2B	24	40	12	26	7	639	639*	0.00	164.61	326	37	11	99	11	1	77
prp-mval2C	24	35	14	22	8	535	535*	0.00	246.58	305	86	4	148	14	0	124
prp-mval3A	24	33	15	22	8	237	237*	0.00	104.12	221	43	2	68	9	0	23
prp-mval3B	24	29	16	18	6	233	233*	0.00	56.23	166	25	4	93	1	0	19
prp-mval3C	24	25	18	15	11	183	183*	0.00	259.21	209	87	10	245	21	6	159
prp-mval4A	41	69	26	41	22	1023	1031	0.78	TL	3713	181	8	284	355	0	4390
prp-mval4B	41	83	19	52	12	1018	1018*	0.00	1750.82	1267	48	12	78	110	0	400
prp-mval4C	41	82	21	50	14	1043	1043*	0.00	8909.32	2263	103	15	226	232	0	3486
prp-mval4D	41	83	21	48	7	1017	1017*	0.00	6724.42	1886	24	6	71	90	1	2834
prp-mval5A	34	74	22	47	15	1104.343	1119	1.31	TL	4781	164	15	291	172	0	4796
prp-mval5B	34	56	35	39	22	1067.115	1076	0.83	TL	4819	195	27	483	375	0	3586
prp-mval5C	34	81	17	51	11	1267	1267*	0.00	4646.25	1655	63	7	110	49	0	2471
prp-mval5D	34	63	29	34	19	966	969	0.31	TL	1723	38	18	122	71	0	7690
prp-mval6A	31	47	22	30	15	551.5	558	1.17	TL	936	70	11	149	60	0	6833
prp-mval6B	31	44	22	26	12	543	543*	0.00	695.23	402	14	6	79	20	0	539
prp-mval6C	31	45	23	28	16	566	566*	0.00	6305.10	1037	68	10	162	120	0	6054
prp-mval7A	40	50	36	28	20	615	615*	0.00	308.53	407	44	18	298	9	0	24
prp-mval7B	40	66	25	43	18	816	816*	0.00	1628.29	1060	49	7	164	58	0	381
prp-mval7C	40	62	28	37	19	746.548	756	1.25	TL	1136	142	19	346	140	0	5862
prp-mval8A	30	76	20	45	8	867	867*	0.00	491.93	666	13	2	23	29	0	105
prp-mval8B	30	64	27	33	16	821.11	825	0.47	TL	1519	179	16	421	85	0	10543
prp-mval8C	30	55	28	35	17	956	959	0.31	TL	2197	100	8	249	53	0	9410
prp-mval9A	50	100	32	65	20	835.5	864	3.30	TL	3267	156	17	253	295	0	2086
prp-mval9B	50	76	44	48	27	755	769	1.82	TL	3891	201	22	455	247	0	2373
prp-mval9C	50	83	42	57	27	784	788	0.51	TL	4329	177	23	445	311	0	2726
prp-mval9D	50	93	38	60	23	823	845	2.60	TL	4439	213	11	305	431	1	1213
prp-mval10A	50	106	32	58	23	1047.926	1049	0.10	TL	2554	97	19	291	85	0	2248
prp-mval10B	50	101	33	63	20	968	1022	5.28	TL	4152	142	19	373	490	0	1466
prp-mval10C	50	100	36	63	21	1008	1013	0.49	TL	4703	129	11	240	414	1	1709
prp-mval10D	50	87	42	58	28	988	1023	3.42	TL	4071	223	32	383	285	0	1950
average gap %									0.72							
maximum gap %									5.28							
# optima									17							

# Numerical Results: sprp-mval dataset

FILE	Instance Features					Main Results				Other Results						
	V	A	E	A <sub>R</sub>	E <sub>R</sub>	LB	UB	GAP	SEC	CON	DIP	SAP	PAP	DKC	SKC	NOD
sprp-mval1A	24	35	20	21	13	317	317*	0.00	226.26	245	22	7	158	8	0	95
sprp-mval1B	24	38	13	25	9	349	349*	0.00	46.08	119	4	4	48	0	0	13
sprp-mval1C	24	36	17	23	10	419	419*	0.00	107.38	204	28	3	71	8	0	6
sprp-mval2A	24	28	16	14	10	482	482*	0.00	1310.76	341	35	5	85	13	0	3514
sprp-mval2B	24	40	12	26	7	505	505*	0.00	68.62	308	20	8	171	17	0	5
sprp-mval2C	24	35	14	22	8	480	480*	0.00	112.85	292	27	4	118	23	0	55
sprp-mval3A	24	33	15	22	8	206	206*	0.00	87.09	174	27	2	45	4	0	3
sprp-mval3B	24	29	16	18	6	175	175*	0.00	228.57	207	33	2	93	8	0	361
sprp-mval3C	24	25	18	15	11	145	145*	0.00	437.61	234	59	5	208	16	0	784
sprp-mval4A	41	69	26	41	22	805	805*	0.00	602.00	959	45	5	136	21	0	29
sprp-mval4B	41	83	19	52	12	880	880*	0.00	6479.35	957	15	6	60	79	0	2237
sprp-mval4C	41	82	21	50	14	828.857	835	0.74	TL	2056	44	9	229	487	0	4077
sprp-mval4D	41	83	21	48	7	819.692	825	0.64	TL	2217	40	7	85	185	0	5089
sprp-mval5A	34	74	22	47	15	849	865	1.85	TL	2678	101	5	385	294	0	4735
sprp-mval5B	34	56	35	39	22	811.197	824	1.55	TL	4103	83	18	584	270	2	4840
sprp-mval5C	34	81	17	51	11	989	989*	0.00	363.71	574	59	4	109	23	0	13
sprp-mval5D	34	63	29	34	19	694	694*	0.00	3806.35	1204	33	13	338	75	0	1261
sprp-mval6A	31	47	22	30	15	482	482*	0.00	16218.55	715	34	7	175	43	0	18745
sprp-mval6B	31	44	22	26	12	420	420*	0.00	493.21	333	25	2	260	24	0	409
sprp-mval6C	31	45	23	28	16	471	471*	0.00	236.32	366	13	4	140	16	0	75
sprp-mval7A	40	50	36	28	20	506.143	508	0.37	TL	1084	78	11	535	19	4	6680
sprp-mval7B	40	66	25	43	18	650	650*	0.00	92.08	155	28	0	52	1	0	0
sprp-mval7C	40	62	28	37	19	599	599*	0.00	2292.64	924	91	5	371	61	0	442
sprp-mval8A	30	76	20	45	8	746	746*	0.00	267.56	490	5	2	24	27	0	5
sprp-mval8B	30	64	27	33	16	711.333	713	0.23	TL	1519	82	11	373	108	0	9558
sprp-mval8C	30	55	28	35	17	747	747*	0.00	2959.65	1124	79	1	210	32	0	1764
sprp-mval9A	50	100	32	65	20	712	718	0.84	TL	2843	33	10	249	210	0	1787
sprp-mval9B	50	76	44	48	27	615.875	632	2.55	TL	3514	124	15	550	469	0	2513
sprp-mval9C	50	83	42	57	27	650.476	668	2.62	TL	4261	74	14	427	353	0	1863
sprp-mval9D	50	93	38	60	23	629	632	0.48	TL	2817	84	9	277	210	0	2520
sprp-mval10A	50	106	32	58	23	865	867	0.23	TL	2433	84	9	336	67	0	1030
sprp-mval10B	50	101	33	63	20	772.5	794	2.71	TL	4535	89	10	345	386	0	1700
sprp-mval10C	50	100	36	63	21	791	791*	0.00	6648.30	2337	95	9	320	167	1	698
sprp-mval10D	50	87	42	58	28	820.625	837	1.96	TL	2488	129	11	434	264	1	1886
average gap %									0.49							
maximum gap %									2.71							
# optima									21							

# Final Remarks

- The PRPP-IS has been introduced and studied.
- Computational results confirm that our branch-and-cut algorithm is an effective solution approach to the problem.
- Details on procedures, applications and results will be provided in a paper next to submission

E. Benavent, Á. Corberán, D. Laganà, F. Vocaturo (2017). Exact Solution of the Periodic Rural Postman Problem with Irregular Services on Mixed Graphs.

**THANK YOU!**