

# Single-vehicle Preemptive Pickup and Delivery Problem

H.L.M. Kerivin<sup>1</sup>, M. Lacroix<sup>2,3</sup> and A.R. Mahjoub<sup>2</sup>

<sup>1</sup>Clemson University

<sup>2</sup>Université Paris-Dauphine

<sup>3</sup>Université Clermont-Ferrand

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# Agenda

- 1 Definition of the problem
- 2 Representations of the solution - Complexity results
- 3 Formulation of the unitary case
- 4 Formulation of the SPPDP

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# Single-vehicle Preemptive Pickup and delivery Problem (SPPDP)

## Input

- Digraph  $D = (V, A)$
- depot  $v_0 \in V$
- Cost vector  $c \in \mathbb{R}^A$  associated with arcs
- $k$  pairs  $(o^p, d^p)$ ,  $p = 1, \dots, k$
- $k$  demands of transportation  $q^1, \dots, q^k$
- Vehicle with limited capacity  $B$

# Single-vehicle Preemptive Pickup and delivery Problem (SPPDP)

## Objective

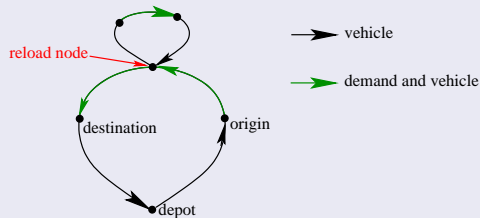
minimizing the vehicle trip cost so that

- The vehicle begins and ends at the depot
- Each arc is used at most once
- Demands are carried from their origin to their destination
- Capacity of the vehicle must not be exceeded
- Transportation with preemption

# Variant of the SPDP

## Transportation using preemption

Demands can be temporary unloaded anywhere.



*Preemptive version* of the problem.

## Remark

No cost nor constraints associated with reloads.

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# Solutions

## Differences with the non-preemptive version

- The vehicle closed walk cannot be only defined by its arc set.
- Demand paths cannot be deduced from the vehicle closed walk.

## A solution is characterized by

- Closed walk of the vehicle
  - Set of arcs
  - Sequence of arcs
- Demand paths
  - Set of arcs



# Information necessary to define a solution

Reducing the number of variables

Can we discard some information ?

Possible only if we can compute the discarded information to obtain a feasible solution or attest there does not exist such discarded information.

Can we discard the following information ?

- arc sets associated with the demand paths
- Sequence of arcs of the vehicle closed walk

# Can we discard the arc sets of the demands paths?

## Demand paths checking problem (simplified version)

- Input
  - Eulerian closed walk  $C$  on an Eulerian digraph  $D = (V, A)$ ,
  - $k$  pairs  $(o^i, d^i)$ ,  $i = 1, 2, \dots, k$ , on  $V$ ,
- Do there exist  $k$  arc-disjoint paths  $L_1, L_2, \dots, L_k$  so that
  - $L_i$  is a  $o^i d^i$ -path ( $i = 1, 2, \dots, k$ ),
  - for each path, the arcs are traversed in the same order as in  $C$ ?

# Can we discard the arc sets of the demands paths?

## Theorem

The demand paths checking problem is NP-complete

## Proof

Reduction from the arc-disjoint paths problem in acyclic digraphs

## Consequences for the SPPDP

Information relative to the arc set of the demand paths is necessary

Can we discard the sequence of arcs of the vehicle closed walk ?

### The Eulerian closed walk with precedence path constraints problem (ECWPPCP)

- Input
  - Eulerian digraph  $D = (V, A)$
  - $v_0 \in V$
  - $k$  paths on  $D$
- Does there exist an Eulerian closed walk on  $D$  satisfying the precedence constraints induced by the simple paths ?

# Results

## Theorem

- ECWPPCP is NP-complete in general,
- Polynomial-time solvable if  $K$  Yout-free ou Yin-free.

# Proof of the NP-completeness of the ECWPPCP

## Reduction from

Directed Hamiltonian Circuit of indegrees and outdegrees exactly two Problem (2DHCP) :

Let  $D_H = (V_H, A_H)$ ,  $V_H = \{v_1, v_2, \dots, v_n\}$ , be a digraph so that  $|\delta^+(v)| = |\delta^-(v)| = 2$  for every  $v$ . Does there exist a Hamiltonian circuit in  $D_H$ ?

## $D_H$ contains $n$ vertices

$D$  contains :

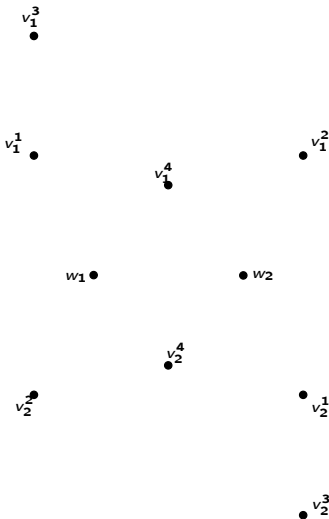
- $4n + 2$  vertices
- $10n + 2$  arcs

$K$  contains  $2n + 1$  paths

# Example of construction



(a) digraph  $D_H$  : Input of 2DHCP

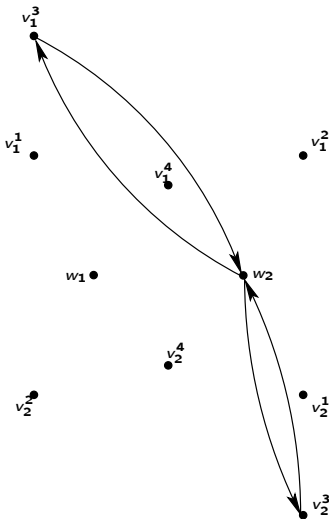


(b) digraph  $D$  : Input of ECWPPCP

# Example of construction



(a) digraph  $D_H$  : Input of 2DHCP



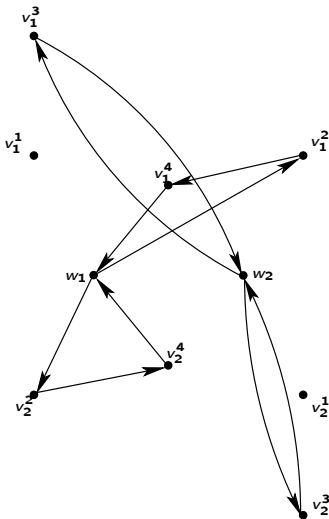
(b) digraph  $D$  : Input of ECWPPCP



# Example of construction



(a) digraph  $D_H$  : Input of 2DHCP

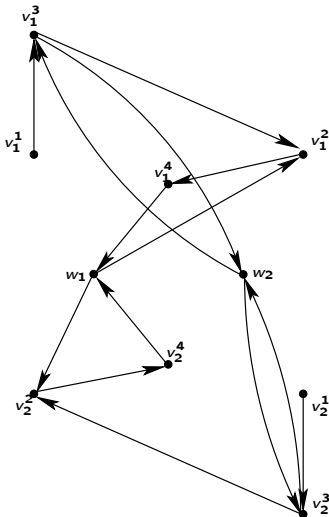


(b) digraph  $D$  : Input of ECWPPCP

# Example of construction



(a) digraph  $D_H$  : Input of 2DHCP

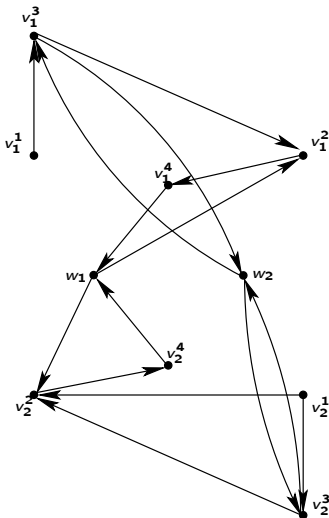


(b) digraph  $D$  : Input of ECWPPCP

# Example of construction



(a) digraph  $D_H$  : Input of 2DHCP

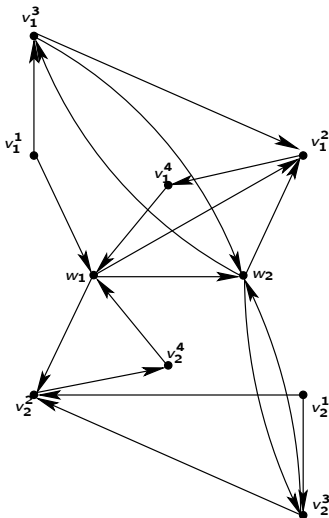


(b) digraph  $D$  : Input of ECWPPCP

# Example of construction



(a) digraph  $D_H$  : Input of 2DHCP

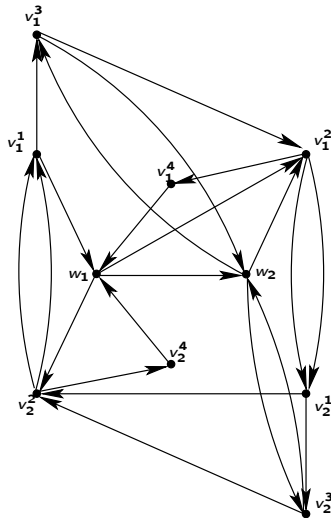


(b) digraph  $D$  : Input of ECWPPCP

# Example of construction



(a) digraph  $D_H$  : Input of 2DHCP

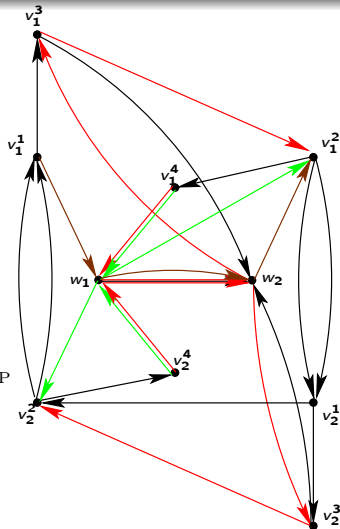


(b) digraph  $D$  : Input of ECWPPCP

# Example of construction



(a) digraph  $D_H$  : Input of 2DHCP



Starting vertex  
 $v_0 = v_1^2$

(b) digraph  $D$  : Input of ECWPPCP

## Polynomial-time solvable case

Hypothesis : the vehicle carries one demand at the same time

### Definition

$K$  Yout-free if every arc has at most one successor in  $K$

### Proposition

$K$  Yout-free. Let  $P = (a_1, a_2, \dots, a_k)$ ,  $k \geq 1$  be an open walk respecting  $K$  and  $v$  be the head of  $P$ . Then, there exist  $a \in \delta^+(v)$  so that  $(a_1, a_2, \dots, a_k, a)$  respects  $K$ .

# Polynomial-time solvable case

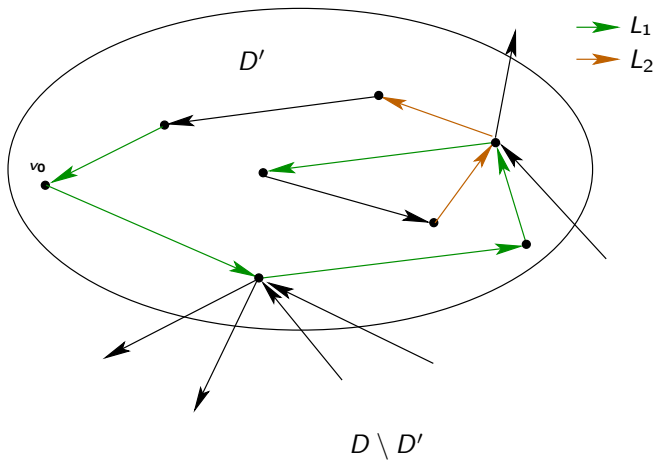
## Definition of the Impregnable Eulerian Subdigraph (IES)

Let  $D'$  be an Eulerian subdigraph of  $D$ .  $v \in V'$  is said  $D'$ -impregnable iff, for every  $a \in \delta_{D'}^{\text{out}}(v)$ , there exists  $a' \in \delta_{D'}^{\text{in}}(v)$  so that

- $a' \prec_K a$  if  $v = v_0$ ,
- either  $a' \prec_K a$  or either  $v$  is incident with no arc of  $A \setminus A'$ , if  $v \neq v_0$ .

$D'$  is said impregnable iff  $v$  is  $D'$ -impregnable for all  $v \in V'$





# Algorithm of the ECWPPCP

**Input** :  $(D, v_0, K)$  with  $K$  Yout-free

**Output** : Feasible solution for the ECWPPCP or impregnable Eulerian subdigraph

1 - Current closed walk  $C = \emptyset$  ( $C$  respects  $K$ )

2 - As long as possible

Find closed walk  $C'$  (possible if non- $D$ -impregnable vertex)

Combine  $C'$  with  $C$

Remove of  $D$  arcs of  $C'$

3 - If  $A = \emptyset$  then feasible solution else IES

## Theorem

If  $K$  Yout-free, then ECWPPCP has a feasible solution iff  $(D, v_0, K)$  does not contain any impregnable Eulerian subdigraph

## Proof

( $\Rightarrow$ ) Definition of impregnable Eulerian subdigraph

( $\Leftarrow$ ) Consequence of Algorithm

## Corollary

If  $K$  Yin-free, then ECWPPCP has a feasible solution iff  $(D, v_0, K)$  does not contain impregnable Eulerian subdigraph

# Consequences for the SPPDP

## Unitary case

Solution can be represented by

- Set of arcs of the vehicle closed walk
- Sets of arcs of the demand paths

## General case

Solution can be represented by

- Set of arcs of the vehicle closed walk
- Sequence of arcs of the vehicle closed walk
- Sets of arcs of the demand paths

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- 1 Definition of the problem
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- 3 **Formulation of the unitary case**
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# Variables

unitary SPPDP : the vehicle can carry one demand at the same time

- Volume of the demands:  $q^p = 1$  for all  $p \in P$
- Capacity of the vehicle :  $B = 1$

## Variables

- $x_a^p = \begin{cases} 1 & \text{if the demand } p \text{ is carried on arc } a, \\ 0 & \text{otherwise,} \end{cases}$   
for all  $a \in A$  and for all  $p \in P$
- $y_a = \begin{cases} 1 & \text{if the vehicle traverses the arc } a, \\ 0 & \text{otherwise,} \end{cases}$   
for all  $a \in A$

## Valid constraints

The digraph induced by the vehicle closed walk is Eulerian

$$\sum_{a \in \delta^{\text{out}}(W)} y_a - y_{a'} \geq 0 \quad \begin{array}{l} \forall W \subset V \text{ with } v_0 \in W, \\ \forall a' \in A(\overline{W}) \end{array} \quad (1)$$

$$\sum_{a \in \delta^{\text{out}}(v)} y_a - \sum_{a \in \delta^{\text{in}}(v)} y_a = 0 \quad \forall v \in V \quad (2)$$

# Valid constraints

Every demand is carried through one path

$$\sum_{a \in \delta^{\text{out}}(v)} x_a^p - \sum_{a \in \delta^{\text{in}}(v)} x_a^p = b_v^p \quad \forall p \in P, \forall v \in V \quad (3)$$

$$\sum_{a \in \delta^{\text{out}}(v)} x_a^p + x_{o^p d^p}^p \leq 1 \quad \forall p \in P, \forall v \in V \setminus \{o^p, d^p\} \quad (4)$$

Demand paths are arc-disjoint

$$y_a - \sum_{p \in P} x_a^p \geq 0 \quad \forall a \in A \quad (5)$$

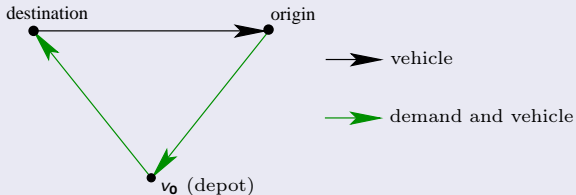


# Precedence problem

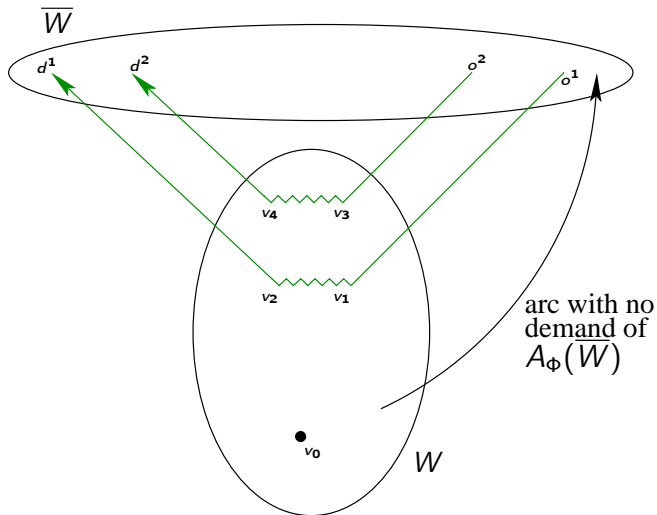
## Remark

Constraints (1)-(5) are not sufficient

## Example



## Additional condition



## Additional constraints

### Vulnerability constraints

Let  $W \subset V$  be so that  $v_0 \in W$ ,  $A_\Phi(\overline{W}) \neq \emptyset$ ,  $\delta_\Phi(W) = \emptyset$ . The vulnerability constraint associated with  $W$

$$\sum_{a \in \delta^{\text{out}}(W)} y_a - \sum_{p \in A_\Phi(\overline{W})} \sum_{a \in \delta^{\text{out}}(W)} x_a^p \geq 1, \quad (6)$$

is valid for the unitary SPPDP.

# Formulation of the unitary SPPDP

$$\mathcal{P}_1 = \{ \min c^T y \mid (x, y) \in \{0, 1\}^n : (x, y) \text{ satisfy (1) - (6)} \}$$

## Theorem

The unitary SPPDP is equivalent to  $\mathcal{P}_1$

Constraints (1) are not necessary if arc costs are positive

## Open question

Complexity of the separation problem of constraints (6)

**Consequence** : Complexity of the linear relaxation of  $\mathcal{P}_1$  is an open question

## Additional constraints

### Relaxed vulnerability constraints

Let  $W \subset V$  be so that  $v_0 \in W$ ,  $A_\Phi(\overline{W}) \neq \emptyset$ ,  $\delta_\Phi(W) = \emptyset$ . The relaxed vulnerability constraint associated with  $W$

$$y(\delta^{\text{out}}(W)) - \sum_{p \in A_\Phi(\overline{W})} x^p(\delta^{\text{out}}(W)) + M \sum_{p \in A_\Phi(W)} x^p(\delta^{\text{out}}(W)) \geq 1, \quad (7)$$

is valid for the unitary SPPDP.

$$\mathcal{P}_2 = \{ \min c^T y \mid (x, y) \in \{0, 1\}^N : (x, y) \text{ satisfy (1) - (5), (7)} \}$$

### Theorem

The unitary SPPDP is equivalent to  $\mathcal{P}_2$

# Separation problem of the relaxed vulnerability constraints

## Theorem

Constraints (7) can be separated in polynomial time.

## Algorithm

- Decomposition in  $|P|$  subproblems
- Auxiliary digraph :
  - Contraction of the vertices  $o^p, d^p$  in  $v_p$  for all  $p \in P$
  - Arc sets  $A^p = \{(v_p, v) : v \in V(p)\}$  for all  $p \in P$
  - $c_a = \begin{cases} +\infty & \text{if } a \in A^p \text{ for all } p \in P, \\ y_a - x_a(P) & \text{otherwise} \end{cases}$
- Computation of a  $v_0 v_p$ -minimum cut for all  $p \in P$

## Consequence

The linear relaxation of  $\mathcal{P}_2$  is polynomial-time solvable.

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# Solutions

## SPPDP (general case)

Several demands can be carried at the same time

$q^p \in \mathbb{Z}_+$  for all  $p \in P$  and  $B \in \mathbb{Z}_+$  with  $q^p \leq B$ , for all  $p \in P$

## Information

- Arc sets of the demand paths
- Arc set of the vehicle closed walk
- Sequence (order) of arcs of the vehicle closed walk  
(Due to the NP-completeness of the ECWPPCP)



# Solutions

## Variables

- Same variables  $(x, y)$  as for the unitary case
- Order on the arcs of the vehicle closed walk may be represented with partial order (linear order on a subset of arcs)

- Partial order may be represented using variables  $(y, \eta)$  with

$$\eta_{aa'} = \begin{cases} 1 & \text{if } a \text{ is before } a' \text{ in the vehicle closed walk,} \\ 0 & \text{otherwise} \end{cases}$$

for all pairs of distinct arcs  $a, a' \in A$

## Generalization of constraints (1)-(6)

### Contraints (1)-(4)

unchanged

### Capacity constraints

$$By_a - \sum_{p \in P} q^p x_a^p \geq 0 \quad (8)$$

for all arcs  $a \in A$

### Vulnerability constraints

$$\sum_{a \in \delta^{\text{out}}(W)} y_a - \left\lceil \frac{1}{B} \sum_{p \in A_\Phi(\bar{W})} \sum_{a \in \delta^{\text{out}}(W)} q^p x_a^p \right\rceil \geq 1 \quad (9)$$

for all vertex subets  $W \subset V$  with  $v_0 \in W$  and  $A_\Phi(\bar{W}) \neq \emptyset$

## Additional constraints

### Partial order constraints

Ensure that  $(y, \eta)$  is a partial order

$$y_a + y_{a'} - \eta_{aa'} - \eta_{a'a} \leq 1 \quad \forall a, a' \in A, a \neq a' \quad (10)$$

$$\eta_{aa'} + \eta_{a'a} - y_a \leq 0 \quad \forall a, a' \in A, a \neq a' \quad (11)$$

$$\eta_{aa'} + \eta_{a'a''} - \eta_{aa''} - y_{a'} \leq 0 \quad \forall a \neq a' \neq a'' \in A \quad (12)$$

### Alternate constraints

Restrict partial orders to those corresponding to closed walks

$$\sum_{a \in \delta^{\text{out}}(v) \setminus \{a'\}} \eta_{aa'} - \sum_{a \in \delta^{\text{in}}(v)} \eta_{aa'} + y_{a'} = 0 \quad \begin{array}{l} \forall v \in V \setminus \{v_0\}, \\ \forall a' \in \delta^{\text{out}}(v) \end{array} \quad (13)$$

$$\sum_{a \in \delta^{\text{out}}(v_0) \setminus \{a'\}} \eta_{aa'} - \sum_{a \in \delta^{\text{in}}(v_0)} \eta_{aa'} = 0, \quad \forall a' \in \delta^{\text{out}}(v_0) \quad (14)$$

## Additional constraints

### Demand precedence constraints

In order to synchronize demand paths and vehicle closed walk

$$x_a^p + x_{a'}^p - \eta_{aa'} \leq 1 \quad \forall p \in P, \forall v \in V \setminus \{o^p, d^p\}, \quad (15)$$

$$\forall a \in \delta^{\text{in}}(v), \forall a' \in \delta^{\text{out}}(v)$$

# Formulation of the SPPDP

$$\mathcal{P} = \{\min c^T y : \{(x, y, \eta) \in \{0, 1\}^n \text{ satisfait } (2)-(4), (8), (10)-(15)\}\}$$

## Theorem

The SPPDP is equivalent to  $\mathcal{P}$

Constraints (1) and (9) are redundant

## Remark

The linear relaxation of  $\mathcal{P}$  is polynomial-time solvable

# Conclusion

## Conclusion

- New complexity results
- New formulations with polynomial-time solvable linear relaxations

## Perspectives

- Polyhedral study of the two formulations  
**Theorem** : Constraints (4)-(6) and trivial constraints define facets
- Branch-and-cut algorithms