# Optimization of a 3-Class-based Dedicated Linear Storage System

Moonhee Yang<sup>\*</sup> • Sun-uk Kim

Department of Industrial Engineering, Dankook University, Cheonan, 330-714

# 3지역 / 지정위치 일차선형 저장시스템의 최적화

### 양문희 · 김선욱

단국대학교 공학부(산업공학전공)

In this paper, we address a layout design problem, PTL[3], for determining an optimal 3-class-based dedicated linear storage layout in a class of unit load storage systems. Our objective is to minimize the expected single command travel time.

We analyze PTL[3] to derive a fundamental property that an optimal solution to PTL[3] is one of the partitions based on the PAI(product activity index)-nonincreasing ordering. Using the property and partial enumeration, we construct an efficient exact algorithm with  $O(n \lfloor \log n \rfloor)$  for solving PTL[3].

Keywords: class-based dedicated storage layout, unit load system, AS/RS

## 1. Introduction

A unit load can be defined as a unit to be moved or handled at one time. A storage system can be called a unit load storage system where unit loads are stored, handled, and retrieved. Automated storage/retrieval systems (AS/RS) or rack-supported storage systems can be the type of unit load systems. K-class-based dedicated storage policy or simply K-class-based storage policy employs K zones in which lots from a class of products, are stored randomly. Tompkins and White(1984) pointed out that class-based storage with randomized storage within each class can yield both the throughput benefits of dedicated storage and the space benefits of randomized storage. Also they suggested that in order to achieve both benefits, three to five classes may be defined.

There have appeared many papers such as Cho and Bozer(2001), Lee(1998), Bozer and Cho(1998), Chang, Wen and Lin(1995), and Hausman, Schwartz and

Graves(1976) so on, which focused on both benefits or either the throughput benefits or the space benefits based on simulation techniques under some operating policies. Yang(2003) suggested a deterministic 2-classbased dedicated storage problem and provide a heuristic algorithm with  $O(n^2)$  as well as a greedy exact algorithm by restricting one-way travel time to a linear form.

In this paper, we define a 3-class-based dedicated linear storage problem, PTL[3], in a unit load system, and provide an efficient exact algorithm in addition to some basic properties. In Section 2, we describe PTL[3] in detail. In Section 3, we prove a fundamental property that an optimal solution to PTL[3] is one of the partitions based on the PAI(product activity index)-nonincreasing ordering, and provide useful properties required for constructing our algorithm. In Section 4, based on the properties and partial enumeration, we construct an efficient exact algorithm with  $O(n \lceil \log n \rceil)$  for solving PTL[3] and we give an example and additional comments.

\* Corresponding author : Professor Moonhee Yang, Department of Industrial Engineering, Dankook University, Cheonan, 330-714, Fax +82-41-550-3570; E-mail myfriend@dankook.ac.kr

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For convenience to reader, the list of symbols used in this paper is given in <Table 1>. To denote optimality for a decision variable, a superscript (\*) will be used at the upper right side of each symbol.

# 2. Description of a 3-Class-Based Linear Storage Problem

Our storage system consists of R storage locations each of which accommodates only one unit load. The storage / retrieval operation is based on the 3-zonebased storage policy and within each zone, a storage location is equally likely to be selected for a storage operation, i.e., random assignment rule (RAN rule) is used.

The expected one-way travel time from a Pick-up/ Deposit (P/D) station to storage location j is given as  $t_j$  for j=1, 2, ..., R. Without loss of generality, it is assumed that  $t_1 \le t_2 \le \cdots \le t_R$ . Let  $A_k$  be a set of storage locations assigned to zone k for k=1, 2, 3. Given the  $t_1$ -nondecreasing ordering, we assign the first  $|A_1|$  storage locations to  $A_1$ , and assign the next  $|A_2|$  storage locations to  $A_2$ , and the remaining storage locations to  $A_3$  where |X| denotes the cardinality of set X. It follows that  $A_1 = \{1, 2, \dots, |A_1|\}, A_2 = \{|A_1|+1, |A_1|+2, \dots, |A_1|+|A_2|\}, \text{ and } A_3 = \{|A_1|+|A_2|+1, |A_1|+|A_2|+2, \dots, R\}.$ 

An arriving replenishment lot of a product i, the size of which is  $r_i$  in unit load, contains a single product and is assigned randomly to open storage locations in one of three separate zones by using an storage/ retrieval (S/R) machine or operator which or who can carry only one unit load at a time. Let  $C_k$  be the set (or class) of products assigned to zone k. Then space requirement or the number of storage locations required for class k,  $R_k$ , can be expressed as

$$R_{k} = |A_{k}| = \sum_{i \in C_{i}} r_{i}$$
(1)

It can be observed that the number of storage locations for a class is not the maximum aggregate

Notation	Meaning					
$A_k$	set of storage locations assigned to zone k					
C <sub>k</sub>	a set of products assigned to class k					
$CAI(N_1, N_2)$	$\sum_{i=N_1}^{N_2} d_i / \sum_{i=N_1}^{N_2} r_i$ given a PAI-nonincreasing ordering					
D	$\sum_{k=1}^{K} D_k = \sum_{i=1}^{n} d_i$					
di	average retrieval rate of product i, for i=1,, n					
D <sub>k</sub>	$\frac{\sum_{i \in C_k} d_i}{\sum_{i \in C_k} d_i}$ average retrieval rate from class k					
$E(SC_K)$	expected SC travel time given K classes					
К	number of classes or zones used in a unit load system					
n	number of products					
$N_k$	number of products assigned to classes 1 through k					
0	PAI-nonincreasing ordering					
P(K)	$\{C_1, C_2, \cdots, C_K\}$ , a partition given K classes					
PAI <sub>i</sub> or PAI(i)	$\underline{d_i}_{r_i}$ , product activity index of product i, for i=1,, n					
r <sub>i</sub>	space requirement of product i when it is replenished					
R	$\sum_{k=1}^{K} R_{k} = \sum_{i=1}^{n} r_{i}$					
R <sub>k</sub>	$ A_k $ , number of storage locations required for zone k					
tj	one-way travel time to storage location j, j=1,, R					
$T_k$	expected SC travel time from an i/o point to zone k					

 Table 1. Notation list

inventory position for a class but the sum of space requirement for products assigned to the class. In fact, the implicit "constant-space assumption" is made since the problem for minimizing the maximum aggregate inventory position is known to be NP-hard [Hall (1987)] and it can make PTL[3] more complicated.

The average demand rate for a product i,  $d_i$  unit loads/unit time, which is defined as the average number of retrievals per unit time, is given as a real constant in advance. Retrievals are performed on first-in first-out basis. The average demand rate from zone k,  $D_k$  is obtained as  $\sum_{i \in C_k} d_i$ . Since practically a class contains at least one product, it can be assumed

that  $|C_k| \ge 1$ . Our objective is to minimize  $E(SC_3)$ , the expected single command(SC) travel time as follows. The

single command(SC) travel time as follows. The expected SC travel time to zone k,  $T_k$ , can be expressed as

$$T_{k} = \frac{2}{|A_{k}|} \sum_{j \in A_{k}} t_{j}$$
(2)

Since the probability of visiting zone k is  $\frac{D_k}{D}$ ,  $E(SC_3)$  can be expressed as

$$E(SC_{3}) = \sum_{k=1}^{3} \frac{D_{k}}{D} T_{k}$$
(3)

$$= \frac{2}{D} \sum_{k=1}^{3} \frac{D_k}{|A_k|} \sum_{j \in A_k} t_j \quad (4)$$

where  $D = \sum_{k=1}^{3} D_k$ . By replacing  $t_j$  with pj+q for constants p and q, Eq.(4) can be further reduced as

$$E(SC_3) = \frac{p}{D} \{D + DR + (R_1D_2 - D_1R_2) + (R_2D_3 - D_2R_3) + (R_1D_3 - D_1R_3)\} + 2q(5)$$

where  $R = \sum_{k=1}^{3} R_k$ .

It can be observed that  $E(SC_3)$  does not depend on  $t_j$  but on  $(r_i, d_i)$ . Since D, R, p and q are constant and each class must contain at least one product, PTL[3] can be stated as

PTL[3] : Given n products with  $\{(r_i, d_i), i = 1, 2, \dots, n\}$ , find an optimal partition,  $P^*(3) = \{C_1^*, C_2^*, C_3^*\}$  such that we

Minimize 
$$Z = (R_1D_2 - D_1R_2) + (R_2D_3 - D_2R_3) + (R_1D_3 - D_1R_3)$$
  
subject to  $|C_k| \ge 1$  for k=1, 2, 3

$$D_{k} = \sum_{i \in C_{k}} d_{i} \text{ for } k=1, 2, 3$$
  

$$R_{k} = \sum_{i \in C_{k}} r_{i} \text{ for } k=1, 2, 3$$

# 3. Basic Properties of PTL[3]

### 3.1 A Necessary Condition

In order to facilitate our analysis, define PTL[K] to be the K-class-based dedicated linear storage problem and define  $P^*(K)$  or  $\{C_1^*, C_2^*, \dots, C_K^*\}$  to be an optimal solution to PTL[K]. Let  $CAI(N_1, N_2)$  be  $\frac{N_2}{N_2} \rightarrow (\frac{N_2}{N_2})$ 

$$\sum_{i=N_1}^{N_2} d_i / \sum_{i=N_1}^{N_2} r_i$$

Yang(2003) analyzed PTL[2] and derived a necessary and sufficient condition to PTL[2]. For convenience, we state his result in Proposition 1 as follows.

Proposition 1.  $P^*(2)$  is optimal to PTL[2] if and only if  $P^*(2)$  satisfies  $PAI(i_1) \ge CAI(1,n) > PAI(i_2)$ where  $i_k \in C_k^*$  for k=1, 2.

Proposition 1 implies that if we take products by PAI-nonincreasing order and if we assign the first  $N_1$  products, each PAI value of which is greater than or equal to CAI(1,n), to  $C_1^*$  and the remaining products to  $C_2^*$ , then  $\{C_1^*, C_2^*\}$  is optimal. In other words,  $P^*(2)$  is one of the partitions based on a PAI-nonincreasing ordering.

The natural question will be whether  $P^*(K)$  is one of the partitions based on a PAI-nonincreasing ordering or not. In what follows, we prove a necessary condition that  $P^*(3)$  is also one of the partitions based on a PAI-nonincreasing ordering. From now on, we assume that a PAI-nonincreasing ordering is given as  $O = (1, 2, \dots, n)$ . Given O, define any candidate solution to PTL[3] as  $X(3) = (N_1, N_2)$  where  $N_k$  denotes the number of products assigned to classes 1 through k for k = 1, 2, 3.

Proposition 2. (i) If  $P^*(3)$  is optimal to PTL[3], then  $P^*(3)$  satisfies  $PAI(i_1) \ge CAI(1, N_2^*) > PAI(i_2)$  $\ge CAI(N_1^*+1, n) > PAI(i_3)$ where  $i_k \in C_k^*$  for k=1, 2, 3. (ii)  $P^*(3)$  is one of the partitions based on a PAI-nonincreasing ordering. Proof : Applying Proposition 1 to classes  $C_1^*$  and  $C_2^*$ , for  $i_1 \in C_1^*$ ,  $i_2 \in C_2^*$ , we have

$$PAI(i_1) \ge CAI(1, N_2^*) > PAI(i_2)$$
(6)

Similarly, applying Proposition 1 to classes  $C_2^*$  and  $C_3^*$ , for  $i_2 \in C_2^*$ ,  $i_3 \in C_3^*$ , we have

$$PAI(i_2) \ge CAI(N_1^*+1, n) > PAI(i_3)$$
(7)

If both Eq.(6) and Eq.(7) do not hold,  $E(SC_3)$  can be further reduced by swapping two products which violate either Eq.(6) or Eq.(7). This is a contradiction to that  $P^*(3)$  is optimal. Hence both Eq.(6) and Eq.(7) hold. By rearranging products in each class by PAI-nonincreasing order, finally  $P^*(3)$  will be one of the partitions based on a PAI-nonincreasing ordering. This completes the proof.

Proposition 2 implies that  $P^*(K)$  is also one of the partitions based on a PAI-nonincreasing ordering. Hence,  $P^*(K)$  can be obtained by enumerating all the possible partitions based on a PAI-nonincreasing ordering.

Now, consider PTL[3]. In order to find a  $P^*(3)$ , it is enough to enumerate  $(N_1, N_2)$ . The total number of candidate solutions will be (n-1)(n-2) since the number of candidate solutions given  $N_1$  is  $(n-N_1-1)$ where  $1 \le N_1 \le (n-2)$ . That is, the total enumeration requires  $O(n^2)$ . However, the total enumeration can be further reduced by introducing "a conditional local optimal solution" as follows.

#### **3.2 Conditional Local Optimal Solution**

Suppose that the first  $N_1$  products of a PAInonincreasing ordering have been assigned to class 1. Then,  $N_2$  can be any value such that  $N_1+1 \le N_2$  $\le (n-1)$ . The next question will be "What value of  $N_2$  gives the minimum  $E(SC_3)$  given  $N_1$ ?" This question corresponds to finding a local optimal solution from a set of solutions;

{
$$(N_1, N_1+1), (N_1, N_1+2), \cdots, (N_1, n-1)$$
}

Clearly the minimization of  $E(SC_3)$  given  $N_1$  is equivalent to solving a 2-class-based dedicated linear storage problem with the last  $(n - N_1)$  products of the PAI-nonincreasing ordering. Let  $(N_1, N_2^c(N_1))$  be the local optimal solution given  $N_1$ . Then from Proposition 1,  $N_2^c(N_1)$  can be determined such that

$$PAI(N_{2}^{c}(N_{1})) \ge CAI(N_{1}+1, n) > PAI(N_{2}^{c}(N_{1})+1)$$
(8)

Similarly, the minimization of  $E(SC_3)$  given the last  $(n - N_2)$  products of a PAI-nonincreasing ordering assigned to class 3 is equivalent to solving a 2-class-based dedicated linear storage problem with the first  $N_2$  products of the PAI-nonincreasing ordering. Let  $(N_1^c(N_2), N_2)$  be the local optimal solution given  $N_2$ . Then, from Proposition 1,  $N_1^c(N_2)$  can be determined such that

$$PAI(N_1^c(N_2)) \ge CAI(1,N_2) > PAI(N_1^c(N_2)+1)$$
 (9)

Hence, in order to find a  $P^*(3)$ , it suffices to enumerate all the local optimal solutions in either set  $E_1$  or set  $E_2$  as follows:

$$E_1 = \{ (N_1, N_2^c(N_1)), N_1 = 1, \cdots, (n-2) \}$$
(10)

$$E_2 = \{ (N_1^c(N_2), N_2), N_2 = 2, \cdots, (n-1) \}$$
(11)

Now, we prove that  $N_2^c(N_1^*)$  is  $N_2^*$ , and that  $N_1^c(N_2^*)$  is  $N_1^*$ .

Property 1. Given an O,	
(i) $N_2^c(N_1^*) = N_2^*$	
(ii) $N_1^c(N_2^*) = N_1^*$	

Proof: (i) Since  $PAI(N_2^c(N_1^*)) \ge CAI(N_1^*+1, n)$ 

(From Eq.(8))

 $> PAI(N_2^*+1)$  (From Proposition 2, (i)), we have

$$N_2^c(N_1^*) \le N_2^*$$
 (12)

Similarly, since  $PAI(N_2^*) \ge CAI(N_1^*+1, n)$  (From Proposition 2, (i)),

$$> PAI(N_2^c(N_1^*) + 1)$$
 (From Eq.(8)

we have

$$N_2^* \le N_2^c(N_1^*)$$
 (13)

Therefore, from Eq.(12) and Eq.(13),  $N_2^c(N_1^*) = N_2^*$ . In the similar manner, (ii) can be proved. This completes the proof.

### **3.3** Lower and Upper Bounds of $N_1^*$

If a lower and an upper bounds of  $N_1^*$  are available, we can further reduce the enumeration. Before we derive a lower and an upper bounds on  $N_1^*$ , we need the following property.

Property 2. Given an O,
(i) N<sup>c</sup><sub>2</sub>(N<sub>1</sub>) is a nondecreasing function of N<sub>1</sub>.
(ii) N<sup>c</sup><sub>1</sub>(N<sub>2</sub>) is a nondecreasing function of N<sub>2</sub>.

Proof : (i) It is enough to prove that  $N_2^c(N_1) \le N_2^c$ (N<sub>1</sub>+1). Since PAI( $N_2^c(N_1)$ )  $\ge$  CAI(N<sub>1</sub>+1, n) (From Eq.(8))  $\ge$  CAI(N<sub>1</sub>+2, n)

 $> PAI(N_2^c(N_1+1)+1)(From Eq.(8)),$ 

we have  $PAI(N_2^c(N_1)) \ge PAI(N_2^c(N_1+1)+1)$ , i.e.,  $N_2^c(N_1) \le N_2^c(N_1+1)$ . In the similar manner, (ii) can be proved. This completes the proof.

Now, consider the following property for a lower and an upper bounds of  $N_1^*$ . Let  $L_k$  and  $U_k$  be a lower and an upper bounds of  $N_k^*$  for k=1, 2 respectively.

Property 3. Given an O,  $L_1$  and  $U_1$  can be obtained by solving the equations below: (i)  $PAI(L_1) \ge CAI(1, N_2^c(1)) > PAI(L_1+1)$ (ii)  $U_1 = N_1^c(n-1)$ 

Proof: (i) Since a possible minimum value of  $L_1$  is 1,  $N_2^c(1) \le N_2^c(L_1) \le N_2^*$ . That is, a possible minimum value of  $N_2^*$  is  $N_2^c(1)$ . Using Proposition 2, (i), we can obtain  $L_1$  such that

$$PAI(L_1) \ge CAI(1, N_2^c(1)) > PAI(L_1+1) \quad (14)$$

(ii) Since a possible maximum value of  $U_2$  is (n-1),  $N_1^c(n-1)$  can be an upper bound of  $N_1^*$ . In a formal way, since  $N_2^* \le U_2$  and  $N_1^c(N_2)$  is a nondecreasing function of  $N_2$ , we have

$$N_1^c(N_2^*) \le N_1^c(U_2)$$
 (15)

Since  $N_1^* = N_1^c(N_2^*)$  from Property 1, (ii), and a possible maximum value of  $U_2$  is (n-1), it follows that

$$N_1^c(N_2^*) = N_1^* \le N_1^c(U_2) \le N_1^c(n-1)$$
 (16)

Thus,  $U_1$  can be obtained from Eq.(16) as

$$U_1 = N_1^c(n-1)$$
 (17)

This completes the proof.

### 4. An Exact Algorithm and an Example

### 4.1 Exact Algorithm

Based on Proposition 2 and properties proved above, an efficient exact algorithm, ALGPTL[3], which solves PTL[3], can be constructed as follows:

ALGPTL[3] Step 1. (Initialization Phase) Take products by PAI-nonincreasing order.  $E(SC_3^*) \leftarrow big value$ Compute  $(L_1, U_1)$  using Property 3. Step 2. (Optimization Phase) For  $N_1 = L_1$  to  $U_1$ , do Begin Find  $N_2^c(N_1)$  such that  $PAI(N_2^c(N_1)) \ge CAI$   $CAI(N_1+1, n) > PAI((N_2^c(N_1)+1))$ Compute  $E(SC_3)$  using  $(N_1, N_2^c(N_1))$ If  $E(SC_3) < E(SC_3^*)$ , then  $E(SC_3^*) \leftarrow$   $E(SC_3)$  and  $(N_1^*, N_2^*) \leftarrow (N_1, N_2^c(N_1))$ End

Proposition 3. ALGPTL[3] solves PTL[3] in  $O(n \lfloor \log n \rfloor)$ .

Proof: Since ALGPTL[3] enumerates all the local optimal solutions given  $N_1$  such that  $L_1 \le N_1 \le U_1$ , ALGPTL[3] solves PTL[3]. Now, Step 1 requires  $O(n \lceil \log n \rceil)$ , the maximum number of iterations of Step 2 is O(n) and finding  $N_2^c(N_1)$  requires  $O(\lceil \log n \rceil)$  since a PAI-nonincreasing ordering is given. It follows that Step 2 requires  $O(n \lceil \log n \rceil)$ . Therefore the time complexity of ALGPTL[3] is  $O(n \lceil \log n \rceil)$ . This completes the proof.

### 4.2 An Example and Additional Comments

Suppose that the input data are given as shown in <Table 2> and  $t_j=j$  for j=1, …, 161. Given  $N_1=1$ ,  $E(SC_3)$  changes depending on the value of  $N_2$  as shown in <Table 3>. It can be clearly observed in <Figure 2> that  $E(SC_3)$  decreases until  $N_2=6$  and increases after  $N_2=6$ , and that  $E(SC_3)$  given  $N_1=1$  is minimized when  $N_2=6$ , i.e.,  $N_2^c(1)=6$ . In the similar manner, changing the value of  $N_1$  from 1 to 8, we can obtain the corresponding value,  $N_2^c(N_1)$ , to  $N_1$  as shown in the second column of <Table 4>. Note that  $N_2^c(N_1)$  is a nondecreasing function of  $N_1$  which was proved in Property 2. From the table, we have  $P^*(3) = (N_1^*, N_2^*) = (3, 7)$ .

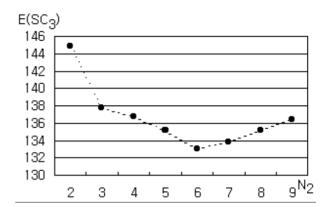
As stated in ALGPTL[3], we take products by PAInonincreasing order as shown in <Table 2>, and assign any big value to  $E(SC_3^*)$ . Using Property 3, (ii), we have  $U_1 = 3$  because  $N_1^c(9) = 3$ . Note that  $PAI_6 = 0.2$ > CAI(2,10) = 0.1795 >  $PAI_7 = 0.1670$  and that  $PAI_3 = 0.25 > CAI(1, 9) = 0.2252 > PAI_4 = 0.2$ . Since  $N_2^c(1) = 6$  and  $PAI_3 = 0.25 > CAI(1,6) =$  $0.2471 > PAI_4 = 0.2$ , we have  $L_1 = 3$ . Note that  $N_1^* = 3$  in this example since  $L_1 = U_1$ .

Since  $PAI_7 = 0.1670 > CAI(4, 10) = 0.1570 > PAI_8$ = 0.1430,  $N_2^* = N_2^c(3) = 7$ . Thus  $X^*(3) = (3, 7)$ , i.e., we assign products 1, 2 and 3 to class 1 and products 4, 5, 6 and 7 to class 2 and the remaining products to class 3, which gives  $E(SC_3) = 131.6774$ .

**Table 3.**  $E(SC_3)$  depending on  $N_2$  given  $N_1 = 1$ 

$N_2$	$E(SC_3)$	$N_2$	$E(SC_3)$
2	144.8387	6*	133.0968*
3	137.7419	7	133.8710
4	136.7097	8	135.1613
5	135.1613	9	136.4516

**Table 2.** Input Data  $\{(r_i, d_i)\}$ 



**Figure 1.** Local optimal solution given  $N_1 = 1$ .

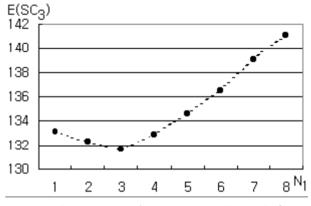


Figure 2.  $E(SC_3)$  given  $N_1 = 1, 2, ..., 8$  from the example.

Product	ri	$d_i$	PAI <sub>i</sub>	Product	ri	di	PAI <sub>i</sub>
1	5	3	0.6000	6	20	4	0.2000
2	15	4	0.2670	7	12	2	0.1670
3	20	5	0.2500	8	7	1	0.1430
4	10	2	0.2000	9	7	1	0.1430
5	15	3	0.2000	10	50	6	0.1200

**Table 4.** Local optimal solutions given  $N_1 = 1, 2, ..., 8$ 

			1					
$N_1$	$N_2^c(N_1)$	$D_1$	$D_2$	$D_3$	R <sub>1</sub>	$R_2$	$R_3$	E(SC <sub>3</sub> )
1	6	3	18	10	5	80	76	133.0968
2	6	7	14	10	20	65	76	132.2903
3*	7*	12	9	10	40	45	76	131.6774*
4	7	14	9	8	50	47	64	132.8387
5	7	17	6	8	65	32	64	134.5807
6	9	21	4	6	85	26	50	136.5161
7	9	23	2	6	97	14	50	139.0323
8	9	24	1	6	104	7	50	141.0968

# 5. Conclusions

In this paper, we introduce a 3-class-based dedicated linear storage problem, PTL[3], for determining an optimal 3-class-based dedicated linear storage layout in a class of unit load storage systems.

We analyze PTL[3] to derive a fundamental property that an optimal solution to PTL[3] is one of the partitions based on the PAI-nonincreasing ordering. Using the property and partial enumeration, we construct an efficient exact algorithm, ALGPTL[3], with  $O(n \mid \log n \mid)$  for solving PTL[3]. Our algorithm could be utilized to construct a heuristic algorithm for solving a 3-class-based dedicated storage problem, which does not assume the linearity of the one-way travel time.

Our strong conjectures are that Proposition 2 could be a sufficient condition and that there might exist a greedy algorithm for PTL[3] like that for PTL[2]. These conjectures can be further investigated.

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