A Partition-Enabled Multi-Mode Band Approach to Arterial Traffic Signal Optimization

Wanjing Ma, Li Zou, Kun An, Nathan H. Gartner, and Meng Wang

Abstract—Arterial traffic signal coordination makes traffic flow more efficient and safer. This paper presents a partition-enabled multi-mode band (PM-BAND) model that is designed to solve the signal coordination problem for arterials with multiple modes, i.e., passenger cars and transit vehicles. The proposed method permits the progression bands to be broken if necessary and optimizes system partition and signal coordination in one unified framework. The impacts of traffic demand of passenger cars and transit vehicles as well as the geometry characteristics of the arterials are taken into account. Signal timings and waiting time of transit vehicles at stations are optimized simultaneously. The PM-BAND model is formulated as a mixed-integer linear program, which can be solved by the standard branch-and-bound technique. Numerical example results have demonstrated that the PM-BAND model can significantly reduce the average number of stops and delay compared with the other models, i.e., MAXBAND and MULTIBAND. Moreover, the progression bands generated by the PM-BAND model have a higher reliability and effectiveness.

Index Terms—Arterial signal coordination, progression band, system partition, transit vehicles.

I. INTRODUCTION

Traffic signals are used to assure safety and mobility. The performance of one isolated intersection is determined by its own signal timings, but also nearby signals. Traffic signal coordination is one of the most important strategies for urban traffic signal control. A well-timed coordinated system permits continuous movement with minimum number of stops and delays, which reduces fuel consumption and improves air quality. Potential benefits that may be observed are smoother traffic flows, more uniform vehicle speeds, and fewer accidents.

Manuscript received March 26, 2017; revised October 8, 2017 and January 11, 2018; accepted February 24, 2018. This work was supported in part by the National Natural Science Foundation of China under Grant 51722309, in part by the National Key Research and Development Program of China under Grant 2016YFE0206800, in part by the Fok Ying-Tong Education Foundation under Grant 151076, and in part by the Humanity and Social Science Youth Foundation of Ministry of Education of China under Grant 16YJCZH070. The Associate Editor for this paper was W. Fan. (Corresponding author: Wanjing Ma.)

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Digital Object Identifier 10.1109/TITS.2018.2815520

Research on traffic signal coordination can generally be divided into two categories: bandwidth-oriented methods and disutility-oriented methods. Examples of bandwidth-oriented methods include MAXBAND [1], MULTIBAND [2], and PASSER II [3]. Such methods provide a progression band for vehicles on the main street and focus on maximizing the bandwidth. Traffic signals tend to group vehicles into a platoon. Under this circumstance, continuous movement of vehicle platoons through successive traffic lights can be maintained. Disutility-oriented methods are meant to seek minimum delay, stops, or other measures of disutility through different combinations of signal timing parameters. Examples of offline disutility-oriented methods include TRANSYT-7F [4] and SIGOP-III [5], adaptive systems include SCOOT [6] and UTOPIA/SPOT [7]. Many engineers prefer bandwidth-oriented methods for the relatively lesser input requirements, operational robustness, and convenient visualization of coordination quality. In addition, bandwidth-oriented methods operate better when the main street flow is predominantly through traffic and the volume turning onto the main street is low [2]. This paper also concentrates on bandwidth-oriented methods, and focuses on offline arterial problem which is the foundation of adaptive network problem.

Morgan and Little [8] first computerized the setting of arterial signals for maximal bandwidth. Little et al. [1] developed the classical MAXBAND model. The model uses mixed-integer linear programming method for optimization. It can determine a global optimal solution and calculates cycle time, offsets, progression speeds, and order of left turn phases to maximize the weighted combination of the bandwidths in both directions along the artery. Later, Chang et al. [9] extended the application of this model to networks and developed the MAXBAND-86 model. To ensure that the signal coordination plan suitably matches the actual traffic demand, Gartner et al. [2] developed the MULTIBAND model, which provides the capability to adapt the progression scheme to the specific traffic flow pattern on each link of the artery. Then, Gartner and Stamatiadis [10] extended the MULTIBAND model to grid networks. A few other methods, which are improvements of the bandwidth-oriented methods, are also available. Tsay and Lin [11] have considered queuing vehicles in detail as well as Lin and Ku [12]. Their models provided an exclusive time for vehicles queuing on a major-street approach to completely discharge and leave the intersection. Zhang et al. [13] proposed an asymmetrical multi-band model to an improved utilization of the available green times and to provide additional opportunities for vehicular progression. To contend with spillback on commuting arterials,
Yang et al. [14] presented three multi-path progression models using path-flow data.

Bandwidth-oriented methods are designed to maximize bandwidth in both directions. However, adequate bandwidth may not be able to be obtained in all cases. In the case where there are an excessive number of intersections or the green split of certain intersections is significantly short, the maximum bandwidth may not be adequate or a feasible solution may not even be available. Besides, the consideration of transit vehicles may increase the difficulty of achieving an adequate bandwidth for passenger cars. In light of these problems, this study proposed a Partition-enabled Multi-mode band (PM-BAND) model, which is designed to solve the signal coordination problem for an arterial with multiple modes, i.e., transit vehicles and passenger cars.

The remainder of this paper is organized as follows. In section II, detailed explanation of the problems is first presented. In section III, the notations adopted in this paper are described. The proposed PM-BAND model is formulated in section IV. The performance of the proposed model is evaluated in section V through extensive numerical and simulation analysis. Conclusions are provided toward the end of the paper.

II. PROBLEM DEFINITION

When adequate bandwidth cannot be obtained, the most common approach is to divide the entire signalized arterial into several subsystems before signal optimization—a technique called system partition [15]. In other words, the progression band is permitted to be discontinued at certain road links. Then, we need to consider the location of the breakpoint and the time at which the progression band is to be partitioned.

The first task is to identify the locations where the arterial is to be partitioned. Tian and Urbanik [16] proposed a method of dividing a major system into several subsystems. Then, the bandwidth is optimized for each subsystem and offsets between subsystems are adjusted. The partition is based on the spacing between intersections as well as traffic flow characteristics, such as volume and queue conditions. Fan and Tian [17] discussed three partition indexes—coupling index (CI), strength of attraction (SA), and coordinatability factor (CF). In selecting of a link for the breakpoint location, one would like to choose a link with lower degree of saturation and more pronounced platoon dispersion. This can be calculated by the indexes mentioned above. However, the breakpoint location has a high influence on the bandwidth solution. The separation of system partition and signal optimization may result in a non-optimal solution. Therefore, this necessitates the formulation of a method that is an integration of system partition and signal optimization.

The second task is to identify when partition is to be conducted. Prior to partition, the adequate bandwidth has to be determined. Fig. 1 illustrates two choices of bandwidth results. Fig. 1 (a) has a narrow progression band through all the intersections while Fig. 1 (b) has a wider band with a breakpoint. With the premise that the vehicles can maintain a specified speed, Fig. 1 (a) is chosen when the traffic demand is low, for example, at night. When the volume is substantially high and the vehicles are likely to drop out of a narrow progression band, for example, during morning rush hours, Fig. 1 (b) is chosen.

Moreover, a further consideration of transit vehicles is necessary. Transit signal priority strategies in a large number of literatures are based on one isolated intersection [18], [19] rather than coordinated signals in the whole artery. The delay of a bus may be reduced due to signal priority at an upstream intersection. However, it may wait longer time at downstream intersections, and the signal priority is not effective for the whole bus travel. Therefore, coordination in the whole artery is necessary [20], [21]. Traffic signal coordination for transit is the provision of an extra progression band for transit based on the knowledge of the transit routes and ridership patterns [22], [23]. Usually, the bandwidths of transit vehicles and passenger cars are balanced by weight index. However, signal control coordination for transit vehicles may be ineffective because of the transit travel time fluctuations caused by interactions with general traffic and dwell-time variability. In the case of bus rapid transit (BRT) systems and modern tram systems, the exclusive lanes render the system highly reliable. The transit progression band can be effectively utilized by these transit vehicles, and a substantially narrow progression band could suffice for a single transit vehicle. This paper focuses on such transit vehicles driving on the exclusive lanes with reliable travel time.

PM-BAND model is dedicated to solving these problems. In summary, it permits the progression bands to be broken if necessary, and it optimizes system partition and signal coordination in one unified framework. The impacts of traffic demand of passenger cars and transit vehicles as well as the geometry characteristics of arterials are taken into account. Signal timings and waiting time of transit vehicles at stations are optimized simultaneously.

III. GENERAL NOTATIONS

PM-BAND is modeled on a two-way arterial with n signalized intersections. As illustrated in Fig. 2, the two travel directions along the artery are referred to be inbound and outbound. The outbound approaching arm j is numbered as 1, the other arms are then numbered consecutively in an anticlockwise direction. The straight-going movement k is numbered as 1. Left-turn movement and right-turn movement are numbered as 2 and 3, respectively. The symbols are defined in Table I and some are presented in Fig. 3. To linearize the
model, a large number of the time variables are in units of cycle time.

For progression bands of passenger cars, we introduce the variables $u_i$ and $p_i$ to depict the location of breakpoint. These variables achieved the integration of system partition and signal timings coordination. On the other hand, we introduce variables $x_i$ for the consideration of traffic demand. In the MULTIBAND model, each directional road section has an individually weighted bandwidth. A higher volume road links are more likely to obtain higher bandwidth. However, the bandwidth may still not be adequate for the actual demand, or the bandwidth could be so high that it is not fully utilized. In the PM-BAND, $x_i$ denotes the necessary bandwidth, which is calculated based on traffic volumes and flow capacities. The necessary bandwidth is the minimum proportion of cycle length, which ensures that all the platooning passenger cars can pass through the section. Furthermore, the PM-BAND model provides each signal bandwidth $b_i$ with at least $x_i$ to ensure that the bandwidth is adequate to accommodate actual volume.

For transit vehicles, the progression bands have fixed bandwidth $b'$ for a single vehicle rather than a platoon. Progression bands of passenger cars are partitioned at signals, while bands of transit vehicles are partitioned first at stations to avoid unnecessary stops at signals. Signal timings and waiting time of transit vehicles at stations are optimized simultaneously. The waiting time at each station includes normal dwell time $a_i$ and extra waiting time $\Delta a_i$. Progression bands of transit vehicles can also be partitioned at signals to ensure there is always a feasible solution.

### IV. MODEL FORMULATION

#### A. Assumptions

- All the vehicles are willing to travel at a given speed along the artery.
- Waiting time of transit vehicles at stations, including normal dwell-time and extra waiting time, can be rigidly
controlled with current available connected vehicle technologies.

B. Objective Function

The objective function consists of six parts: maximizing the number of nonstop passenger cars, maximizing the weighted bandwidth of passenger cars, minimizing the platoon waiting time of passenger cars, minimizing the number of stops of transit vehicles, maximizing the bandwidth of transit vehicles, and minimizing the extra waiting time of transit vehicles at stations and delay caused by red light. The smaller the value of the number of nonstop passenger cars, maximizing the weighted

\[ K_1 \sum_i \left[ \tilde{q}_1^i (1 - p_i) + \tilde{q}_1^i (1 - \tilde{p}_i) \right] + K_2 \sum_i [q^i_b + \tilde{q}_1^i b_1] - K_3 \sum_i [q^i_w u_i + \tilde{q}_1^i u_i] - K_4 \sum_i (p_i^* + \tilde{p}_i) + K_5 b_i - K_6 \sum_i (\Delta a_i + \Delta \tilde{a}_i + u_i^* + \tilde{u}_i^*), \]

\[ K_1 \gg K_2 \gg K_3, K_4 \gg K_5 \gg K_6. \] (1)

\( K_1 \) is the weight of the number of nonstop passenger cars, which is the primary objective. \( K_2 \) is the weight of bandwidth, which is required in the constraints to be greater than the necessary bandwidth. We make it as large as possible to make the model more robust. \( K_3 \) is the weight of platoon waiting time when there is a breakpoint. This is equivalent to the coordination between subsystems. Following paragraphs explain the highest priority objective of passenger cars: maximizing the number of nonstop passenger cars.

First, the part of traffic, which is the object of signal coordination, has to be identified. As shown in Fig. 4, \( Q_{i1} \gamma_{i1} \), the straight-going traffic volume along artery at \( S_i \) in the outbound direction, consists of two parts. The part \( q_1^i * \) is a straight-going traffic volume along artery at \( S_{i-1} \). The other is traffic volume turning into the artery from \( S_{i-1} \) or access between \( S_{i-1} \) and \( S_i \). Signal coordination is mainly in order to let \( q_1^i * \) rather than the entire \( Q_{i1} \gamma_{i1} \), goes through the intersection without stopping. To simplify the problem, the model assumes the turning flow, i.e., the volume in \( Q_{i1} \gamma_{i1} \) except \( q_1^i * \), can drain into main platoon spontaneously after \( S_i \). \( q_1^i * \) is calculated as follows:

\[ Q_{i1} = \left( Q_{i1-1,1} \gamma_{i-1,1-1} \gamma_{i,1-1,1} + Q_{i1-1,2} \gamma_{i-1,1-1,2} \gamma_{i,1-1,1,2} \right) (1 - AO_{i-1} - AI_{i-1}), \]

\[ Q_{i3} = \left( Q_{i+1,1,3} \gamma_{i+1,3,1} \gamma_{i,1,3,1} + Q_{i+1,2} \gamma_{i+1,3,1,2} \gamma_{i,1,3,1,2} \right) (1 - AO_i + AI_i), i = 1, \ldots, n. \]

\[ q_1^i *= Q_{i1-1,1,1} \gamma_{i-1,1,1} \gamma_{i,1,1,1} (1 - AO_{i-1}), i = 2, \ldots, n. \]

\[ q_1^i *= Q_{i1+1,3} \gamma_{i+1,3,1} \gamma_{i,1,3,1} (1 - AO_i), i = 1, \ldots, n - 1. \]

Constraints (6) and (7) are limitations of the road link speed and the changes in speed, respectively. Constraint (8) ensures that the speeds of outbound and inbound traffic are the same between two adjacent intersections. When conditions permit, this constraint may be rendered unnecessary.

\[ \frac{d_i}{f_i} z_t \leq t_i \leq \frac{d_i}{e_i} z_t, i = 1, \ldots, n - 1. \] (6)

\[ \frac{d_i}{h_i} z_t \leq \frac{d_i}{g_i} z_t, i = 1, \ldots, n - 2. \] (7)

Constraints (9) are the signal timing restraints of every two adjacent intersections. It should be noted that, for this proposed partition-enabled band, we add variables \( u_i \) unlike the MAXBAND model.

\[ (w_i - \tilde{w}_i) - (w_{i+1} - \tilde{w}_{i+1}) + (t_i + \tilde{t}_i) + (u_{i+1} + \tilde{u}_i) \]

\[ + \delta_i L_i - \tilde{\delta}_i L_i - \tilde{\delta}_i L_i + \tilde{\delta}_i \tilde{L} \]

\[ = - (r_i - \tilde{r}_i) + (r_{i+1} - \tilde{r}_{i+1}) + m_1 i, i = 1, \ldots, n - 1; \] (9)

\( m_1 \) integer; \( \delta_i, \tilde{\delta}_i \) zero/one variable.

Fig. 4. Traffic volume composition.

Constraints (10)–(11) are related to decision variables \( u_i \) and \( u_i \). \( u_i \) is the centerline of outbound shifted time at intersection \( S_i \), i.e., the platoon waiting time when the progression band is partitioned. If \( u_i > 0 \), the progression band is partitioned at the upstream link of \( S_i \) and \( p_i = 1 \). Otherwise, \( u_i = 0 \), then \( p_i = 0 \). If the outbound progression band is not partitioned at the upstream link of \( S_i+1 \), then \( p_{i+1} = 0 \) and according to the constraint (11) \( b_{i+1} = b_i \). This implies that the upstream link and downstream link of \( S_i+1 \) have the same bandwidth. On the contrary, if the progression band is partitioned, then the upstream link and downstream link of \( S_i+1 \) may have different
bandwidths.

\[ \varepsilon p_i \leq u_i \leq p_i, \quad i = 1, \ldots, n. \]
\[ -\varepsilon p_{i+1} \leq b_{i+1} - b_i \leq \varepsilon p_{i+1}, \quad i = 1, \ldots, n - 1. \]

Constraint (12) and (13) are to ensure the effectiveness of the progression bands, i.e., the actual utilization of the progression bands by the platoon. As Fig. 5 illustrates, in situation A, the platoon would leave \( S_i \) exactly when the traffic light is green while the solution band begins after a period of time. If the progression band is partitioned at the upstream link of \( S_i \), then \( p_i = 1 \) and \( u_i = 0.5b_i \) according to constraints (4) and (12). This implies that the progression band would begin exactly when the traffic light is green. In situation B, progression band is partitioned at \( S_i \), while a few passenger cars do not leave \( S_i \) in the new started progression band. Constraint (13) requires that the first passenger car in the platoon arrive at \( S_i \) during red time when there is a breakpoint.

\[
\begin{align*}
& w_i \leq b_i/2 + 1 - p_i, \\
& \bar{w}_i \leq b_i/2 + 1 - \bar{p}_i, \\
& w_{i+1} + r_{i+1} - u_{i+1} \geq b_{i+1}/2, \\
& \bar{w}_i + \bar{r}_i - \bar{u}_i \geq b_{i+1}/2, \\
& b_i \geq x_i, \\
& \bar{b}_i \geq \bar{x}_i, \\
& i = 1, \ldots, n. \quad (14)
\end{align*}
\]

As mentioned above, the PM-BAND model provides each signal bandwidth \( b_i \) with a bandwidth equal to or more than the necessary bandwidth \( x_i \) in order to ensure that it is adequate to satisfy the actual volume, the formulation is given by (14).

2) Transit Vehicles Constraints: Constraints (15)–(24) are related to transit vehicles.

Constraint (15) requires that the transit vehicles’ bandwidth is higher than the lower limit \( b'_{\text{min}} \). \( b'_{\text{min}} \) is determined by the permitted fluctuations in transit travel time. Constraint (16) ensures that the bandwidths of the outbound and inbound transit vehicles are equal. In most cases, the difference in this value of the transit vehicles moving in either direction is insignificant.

\[ b' \geq b'_{\text{min}}. \quad (15) \]
\[ b = b'. \quad (16) \]

Constraint (17) is related to the position of transit vehicles progression bands. Constraints (18) are the signal timing restraints of every two adjacent intersections.

\[
\begin{align*}
& \frac{b'_{i+1}}{2} \leq \bar{w}_i \leq 1 - \bar{r}_i - \frac{b'_{i+1}}{2}, \\
& \frac{b'_{i+1}}{2} \leq w_i \leq 1 - r_i - \frac{b'_{i+1}}{2}, \\
& (w_i - \bar{w}_i) - (w_{i+1} - \bar{w}_{i+1}) + (t'_i + \bar{t}_i) + (u'_{i+1} - \bar{u}_{i+1}) + \theta_i Li_i - \bar{\theta}_i Li_i - \theta_i Li_i + \bar{\theta}_i Li_i = - (r_i - \bar{r}_i) + (r_{i+1} - \bar{r}_{i+1}) + m_2, \\
& i = 1, \ldots, n. \quad (17)
\end{align*}
\]

Constraints (19) and (20) are limitations of the transit vehicles link speed and the changes in speed, respectively. It should be noted that the travel time \( t_i \) of transit vehicles includes dwell-time \( a_i \) and extra waiting time \( \Delta a_i \) at stations. Variables \( \Delta a_i \) transfer the extra waiting time from signals to stations and thus reduce the number of stops. The extra waiting time should not be excessively large, and therefore, there is an upper limit \( \Delta a_{\text{max}} \) as provided by constraint (21). If there is no transit station between \( S_i \) and \( S_{i+1} \) in the outbound direction, i.e., \( \theta_i = 0 \), then, there is no extra waiting time and \( \Delta a_i = 0 \).

\[
\begin{align*}
& (d_i/\bar{f}_i')z \leq t'_i - \theta_i a_i z - \Delta a_i \leq (d_i/\bar{f}_i')z, \\
& (d_i/\bar{f}_i')z \leq t'_i - \bar{\theta}_i a_i z - \bar{\Delta}a_i \leq (d_i/\bar{f}_i')z, \quad i = 1, \ldots, n. \quad (19)
\end{align*}
\]

Because the waiting time at stations of transit vehicles can be rigidly controlled, we usually partition the progression bands at stations to transfer delay at intersections to stations and avoid unnecessary stops. However, if there is no feasible solution when only partition at stations, it also need to be partitioned at signals. Similar to the constraints for passenger cars, constraints (22)–(24) are for the partition of transit vehicles progression bands at signals.

\[
\begin{align*}
& \varepsilon p_i \leq u'_i \leq p_i, \\
& \varepsilon \bar{p}_i \leq \bar{u}_i \leq \bar{p}_i, \\
& w_i \leq \frac{b'_i}{2} + 1 - p_i, \\
& \bar{w}_i \leq \frac{b'_i}{2} + 1 - \bar{p}_i, \\
& w_{i+1} + r_{i+1} - u_{i+1} \geq \frac{b'_{i+1}}{2}, \\
& \bar{w}_i + \bar{r}_i - \bar{u}_i \geq \frac{b'_{i+1}}{2}, \\
& i = 1, \ldots, n. \quad (22)
\end{align*}
\]

3) Mutual Constraints: Constraint (25) is a limitation on cycle length. \( O_i \) is the offset between \( S_i \) and \( S_{i+1} \). Constraints (26)–(27) ensure that the passenger cars progression bands and transit vehicle progression bands have identical.
offsets.
\[
1/C_2 \leq z \leq 1/C_1.
\]
\[
C_1 = w_i + t_i - w_{i+1} + u_{i+1}, i = 1, \ldots, n - 1.
\]
\[
C_2 = w_i + t_i - w_{i+1} + u_{i+1} = w_i' + t_i' - w_{i+1}' - m3, i = 1, \ldots, n - 1; m3 \text{ integer.}
\]

D. Solution

The PM-BAND model is formulated as a mixed-integer linear programming and is solved by the standard branch-and-bound technique. Many software, such as LINGO and CPLEX, has the default solver to solve MILP problem, usually branch-and-bound. And a customized design is not necessarily required. In addition to the optimization variables including cycle length, offsets, progression speeds, and order of left turn phases (as in MAXBAND or MULTIBAND model), the PM-BAND model can also determine a global optimal solution and calculate location of breakpoints, platoon waiting time when partitioned, and extra waiting time at stations of transit vehicles. Although the PM-BAND substantially increases the number of variables and constraints compared with the MAXBAND or MULTIBAND, this causes no computational difficulty with present computers.

V. NUMERICAL EXAMPLE

A. Site Description

Huaide road (Fig. 6), an artery with eight two-way lanes including two BRT exclusive lanes, is in the Changzhou, China. We selected a 5.2 km segment with 16 signalized intersections as the coordination objects (Some approaches of specific intersections adopt protected left-turn phase). BRT line 2 passes this artery and there are seven BRT stations in each direction. The distance between every two adjacent intersections and red time are shown in Table II. And we listed in each direction. The distance between every two adjacent

<table>
<thead>
<tr>
<th></th>
<th>(d_i (\delta_i))</th>
<th>(\tau_i (\tau_i))</th>
<th>(q_i^*)</th>
<th>(q_i^\prime)</th>
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<tr>
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<tr>
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<td>0.609</td>
<td>0.753</td>
</tr>
<tr>
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<td>0.383</td>
<td>0.829</td>
</tr>
<tr>
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</tr>
<tr>
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<td>521</td>
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<td>0.601</td>
<td>1.115</td>
</tr>
<tr>
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<td>0.601</td>
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<td>0.559</td>
<td>0.845</td>
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<td>0.522</td>
<td>0.611</td>
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<tr>
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<tr>
<td>S14</td>
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<td>S15</td>
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<td>0.690</td>
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</tr>
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</table>

B. PM-BAND Model Results

According to field road conditions, the values of the parameters are as follows: \(C_1 = 90\) s, \(C_2 = 110\) s; \(a_i (\bar{e}_i) = 11.5\) m/s, \(f_i (\bar{f}_i) = 13.5\) m/s, \(g_i (\bar{g}_i) = -\infty\); \(h_i (\bar{h}_i) = +\infty\); \(e_i (\bar{e}_i) = 11.5\) m/s, \(f_i (\bar{f}_i) = 13.5\) m/s, \(g_i (\bar{g}_i) = -\infty\); \(h_i (\bar{h}_i) = +\infty\); \(\alpha_i (\bar{a}_i) = 18\) s, \(\Delta a_i (\bar{a}_i) = 0\); \(b_{\min} \leq 8\) s. \(h_i (\bar{h}_i) = +\infty\); \(\alpha_i (\bar{a}_i) = 18\) s, \(\Delta a_i (\bar{a}_i) = 0\); \(b_{\min} \leq 8\) s.

The results of signal coordination in the PM-BAND model considering both passenger cars and transit vehicles are illustrated as Fig. 7, and those considering passenger cars only in Fig. 8. In Fig. 7, both outbound and inbound passenger cars progression band is partitioned into four parts. The optimal cycle length is 101 s. Passenger cars progression band speed is 13.5 m/s.

When considering both passenger cars and transit vehicles, results showed more number of partitioned subsystems for progression band of passenger cars in Fig. 7. This, in turn, it demonstrates that the partition technique is necessary when solving multi-mode progression band problem with multiple signals. Furthermore, the breakpoint location for passenger cars progression band is very different between Fig. 7 and
the travel distance in the artery of vehicle \( m \) and the unit is kilometer. The other two indexes (band coverage and drop-out rate) are elaborated later.

1) Results of Considering Passenger Cars and Transit Vehicles: Arterial signal optimization results of the partitioned MAXBAND model and the partitioned MULTIBAND model when considering both passenger cars and transit vehicles are illustrated on the time-space diagram as Fig. 8. As the results show, the basic MAXBAND model and the basic MULTIBAND model yielded no feasible solution. The PM-BAND model has the fewest average number of stops and least average delay compared with the partitioned MAXBAND model and the partitioned MULTIBAND model. Compared to the PM-BAND model, the average number of stops of the partitioned MULTIBAND model by 9%.

2) Results of Considering Only Passenger Cars: In the most practical situations, only passenger cars, rather than both passenger cars and transit vehicles, need to be taken into account. Therefore, we also evaluated the PM-BAND model taking only passenger cars into consideration.

Arterial signal optimization results of the four compared models without taking into consideration transit vehicles are illustrated on the time-space diagram as Fig. 10, and VISSIM simulation results are summarized in Table IV. For both MAXBAND and MULTIBAND models, the application of partition technique here reduced average number of stops and delay. Moreover, PM-BAND performs better than any of the four compared models. Compared to PM-BAND model, the average number of stops of basic MAXBAND model, basic MULTIBAND model, partitioned MAXBAND model, and partitioned MULTIBAND model is higher by 42%, 15%, 20%, and 13%, respectively.

3) Two New Proposed Performance Indexes: We proposed two performance indexes—band coverage and drop-out rate, which are presented in Table III and Table IV. These two indexes are used to evaluate the effectiveness and reliability of passenger cars progression band. Band coverage is the proportion of trajectory points covered by progression bands among all the trajectory points in the artery. Usually the wider the bandwidth, the greater the value of band coverage is and more effective progression bands are. Drop-out rate is the proportion of vehicles that drop out from the progression bands among all the vehicles that enter the progression bands. The smaller the value of drop-out rate is, the more smoothly vehicles follow the progression bands and more reliable progression bands are.

We extracted trajectory points of all the passenger cars traveling in the artery from the VISSIM simulation road network. Then, the two performance indexes were calculated, i.e., band coverage and drop-out rate. The calculation results are listed in Table III and Table IV. When considering passenger cars and transit vehicles, band coverage in basic MAXBAND and MULTIBAND models is very low while it is significantly improved in partitioned MAXBAND and MULTIBAND models. Partition technique produces the improved results in this case. Moreover, under all conditions, both band coverage and drop-out rate of the PM-BAND perform better than those in other models. The drop-out rate of PM-BAND model is
TABLE III
VISSIM SIMULATION RESULTS OF CONSIDERING BOTH PASSENGER CARS AND TRANSIT VEHICLES

<table>
<thead>
<tr>
<th>Model</th>
<th>Average number of stops</th>
<th>Average delay (s/veh/km)</th>
<th>Band coverage (%)</th>
<th>Drop-out rate (%)</th>
</tr>
</thead>
<tbody>
<tr>
<td>PM-BAND</td>
<td>1.14</td>
<td>49.09</td>
<td>65.01</td>
<td>20.62</td>
</tr>
<tr>
<td>Basic MAXBAND</td>
<td>*</td>
<td>*</td>
<td>*</td>
<td>*</td>
</tr>
<tr>
<td>Partitioned MAXBAND</td>
<td>1.31(+15%)</td>
<td>52.67(+6%)</td>
<td>42.11</td>
<td>53.17</td>
</tr>
<tr>
<td>Basic MULTIBAND</td>
<td>*</td>
<td>*</td>
<td>*</td>
<td>*</td>
</tr>
<tr>
<td>Partitioned MULTIBAND</td>
<td>1.24(+9%)</td>
<td>51.18(+3%)</td>
<td>20.72</td>
<td>52.05</td>
</tr>
</tbody>
</table>

* no feasible solution

Fig. 9. Results of time-space diagram considering both passenger cars and transit vehicles. (a) Partitioned MAXBAND. (b) Partitioned MULTIBAND.

Fig. 10. Results of time-space diagram considering only passenger cars and transit vehicles. (a) Basic MAXBAND. (b) Basic MULTIBAND. (c) Partitioned MAXBAND. (d) Partitioned MULTIBAND.

20.62% when considering both passenger cars and transit vehicles and is only 12.88% when considering passenger cars only. This demonstrates that the solving progression bands of PM-BAND model have a high reliability, and once the passenger cars enter the progression band, they can conveniently follow the progression band until they leave the artery.

TABLE IV
VISSIM SIMULATION RESULTS OF CONSIDERING ONLY PASSENGER CARS

<table>
<thead>
<tr>
<th>Model</th>
<th>Average number of stops</th>
<th>Average delay (s/veh/km)</th>
<th>Band coverage (%)</th>
<th>Drop-out rate (%)</th>
</tr>
</thead>
<tbody>
<tr>
<td>PM-BAND</td>
<td>0.93</td>
<td>35.02</td>
<td>61.96</td>
<td>12.88</td>
</tr>
<tr>
<td>Basic MAXBAND</td>
<td>1.32(+42%)</td>
<td>51.38(+47%)</td>
<td>20.07</td>
<td>43.78</td>
</tr>
<tr>
<td>Partitioned MAXBAND</td>
<td>1.12(+20%)</td>
<td>44.99(+28%)</td>
<td>55.09</td>
<td>42.39</td>
</tr>
<tr>
<td>Basic MULTIBAND</td>
<td>1.07(+15%)</td>
<td>42.38(+21%)</td>
<td>14.55</td>
<td>49.90</td>
</tr>
<tr>
<td>Partitioned MULTIBAND</td>
<td>1.05(+13%)</td>
<td>39.87(+14%)</td>
<td>52.30</td>
<td>50.40</td>
</tr>
</tbody>
</table>

Fig. 11. PM-BAND model—outbound trajectory points.

To visually demonstrate the meaning of the proposed two performance indexes—band coverage and drop-out rate, we draw trajectory points on the time-space diagram. Because of the limitation set by this manuscript’s page size, only the results of the outbound direction based on PM-BAND, basic MAXBAND, and partitioned MULTIBAND models, which only considers passenger cars, are showed in Fig. 11, Fig. 12 and Fig. 13, respectively. The boundary of progression bands are colored blue, the trajectory points inside progression bands are colored green, and the trajectory points outside progression bands are colored red. Furthermore, band coverage is the proportion of green trajectory points among all trajectory points.

In the PM-BAND model, as shown in Fig. 11, most of the trajectory points are inside progression bands, and once the passenger cars enter a progression band, they can conveniently follow the progression band until they leave the artery. In basic MAXBAND model, as shown in Fig. 12, the progression band is too narrow to adapt to actual traffic demand. The
trajectory points of only a small number of vehicles are inside progression bands. Moreover, the passenger cars inside the progression bands have a high tendency to drop out from the progression bands. As shown in Fig. 13, the partitioned MULTIBAND model provides different bandwidths to each road link. However, the platoon cannot contract and expand in tandem with the different bandwidths. Thus, the bandwidth of a few road links cannot be fully utilized by passenger cars, and a few others are too small to adapt traffic volume.

4) Sensitivity Analysis: The sensitivity analysis is to assess the performance of PM-BAND model under different traffic demand scenarios. We compare the PM-BAND with the Partitioned MULTIBAND model, which perform the best in the four compared models. Based on the volume in Table II, five traffic scenarios are added, which are 0.2, 0.5, 0.8, 1.2 and 1.5 times of the volume respectively (corresponding to the different values of the parameters $\mu$). When $\mu = 1.5$, some intersections just reach the saturation state. Simulation results are shown in Table V. The values outside the brackets are the results of the PM-BAND, and the values in the brackets are the changes in the PM-BAND relative to the Partitioned MULTIBAND model.

The results show that the performance of the PM-BAND is far better than the Partitioned MULTIBAND in low demand. However, when the demand is high, due to the random fluctuations of the volume, some cycles are oversaturated, which will greatly increase stops and delay. Hence, when the demand is high, the performance of the PM-BAND is slightly worse than the Partitioned MULTIBAND, while the indicator Drop-out rate of the PM-BAND always perform very well.

VI. CONCLUSIONS AND DISCUSSIONS

A partition-enabled multi-mode band (PM-BAND) model for arterial traffic signal coordination has been presented in this paper. The model solves the problem through the partition approach when it is difficult to achieve realistic progression bands. The PM-BAND model is formulated as a mixed-integer linear program and can be solved using the standard branch-and-bound technique. The main improvements of PM-BAND model are as follows:

- System partition and signal coordination of two traffic modes, i.e., passenger cars and transit vehicles, have been considered in one unified framework.
- The model adapts better to the field traffic demand.
- Signal timings and waiting time of transit vehicles at stations are optimized simultaneously.

Numerical analyses are conducted to evaluate the performance of the proposed PM-BAND model by comparing it to the basic MAXBAND, basic MULTIBAND, partitioned MAXBAND, and partitioned MULTIBAND models. VISSIM simulation results demonstrated that PM-BAND model can significantly reduce average number of stops and delay when compared with the other models. Furthermore, we proposed two performance indexes: band coverage and drop-out rate to evaluate the effectiveness and reliability of progression bands. The results
demonstrate that calculating progression bands by the PM-BAND model have high reliability and vehicles can effectively utilize the progression bands.

The PM-BAND model focused on offline control problem in the artery. The fluctuations of traffic demand have an adverse effect on controller. Therefore, when there is an obvious fluctuation in traffic demand, a reactive strategy would be preferred. Moreover, this model is built under under-saturated traffic, so no feasible solution might be provided when under over-saturated traffic. The extension of the proposed model to actuated control is expected. Other concerns such as over-saturated conditions can also be included.

REFERENCES


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