

Research Article

Research on the Cooperative Control Method of Intermittent Bus Lane and Downstream Intersection

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Intermittent bus lane (IBL) used for bus priority is a lane in which the status of a given section changes according to the presence or absence of a bus in its spatial domain. Therefore, when bus services are not so frequent, general traffic will not suffer much, and bus priority can still be obtained. In order to further explore the road resource utilization, a signal timing optimization model was proposed considering coordinate intermittent bus lanes and downstream intersections. Firstly, the functional relationship was established between the general vehicle carrying capacity and the social vehicle arrival rates, the distribution of public transportation vehicles, and the downstream intersection timing plan; then, a bilevel programming model was built which maximizes the social vehicle carrying capacity and simultaneously minimizes the delay of general vehicle intersections. Finally, the optimal solution of carrying capacity under different scenarios was analyzed through experimental simulation, which effectively reduced the delay and proved the effectiveness of the proposed method.

1. Introduction

In recent years, the problem of urban traffic congestion has become increasingly severe. The establishment of bus lanes is of great significance for improving the operation efficiency of public transportation, but the establishment of bus lanes has not achieved the expected results. In order to improve bus priority efficiency and road resource utilization, in 1997, Viegas and Lu [1] first proposed the concept of intermittent bus lane (IBL) in the traffic control system, which attracted widespread attention. Follow-up scholars conducted more in-depth research and achieved fruitful results. For the setting and implementation of bus lanes, Youbang and Li [2] conducted partial simulations on the traffic operation of intermittent bus lanes and explored the applicable conditions of the IBL strategy in terms of basic graphs, time-space graphs, average speed, and speed stability; Xianmin and Mingye [3] proposed a method for determining the clearing distance of dynamic lanes. Based on the HCM2010 vehicle delay formula and road resistance function, a model of the average and per capita travel time of vehicles under different

road conditions was established, and the setting conditions of the bus lane were given; Qiufeng and Wenquan [4] analyzed the variation of the total delay error of the intersection before and after the intermittent bus entrance lane was set up and found that when the traffic saturation of the entrance lane is less than the critical traffic saturation, the delay in setting the intermittent bus-dedicated entry lane is lower; in exploring the capacity in terms of influencing factors, Yulin et al. [5] improved the space utilization rate by dynamically controlling the opening time of intermittent bus entrance lanes to social vehicles and conducted a quantitative analysis of social vehicle delays at intersections; Dingxin [6] introduced the anticollision rule which puts forward the capacity reduction mechanism of intermittent priority bus lanes and concluded that the increase in clearing distance and the decrease of the bus departure interval will reduce the capacity of intermittent priority bus lanes; Eichler and Daganzo [7] used the theory of distributed waves. The analysis found that social traffic saturation and bus departure frequency are the key factors that affect the effectiveness of intermittent bus lanes; Wu et al. [8] formulated mandatory

II. SIGNAL TIMING OPTIMIZATION MODEL CONSIDERING THE INFLUENCE OF SOCIAL VEHICLES ON INTERMITTENT BUS LANES

A. Bearing Capacity Analysis for General Vehicles

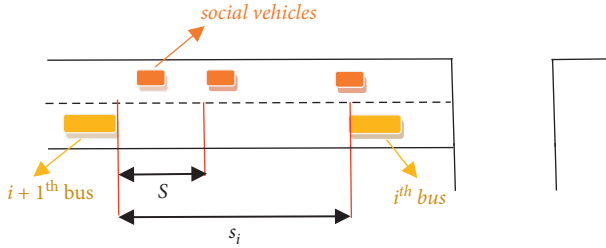


FIGURE 1: Bearing capacity diagram for general vehicles.

intermittent bus lane-changing rules in a vehicle-route coordination environment. The simulation model was used to analyze the control effect under different departure time intervals and vehicle density; Qiu [9] and others analyzed the impact of the IBL on the traffic density, speed, and flow of the road section through computer simulation, indicating that the service level is the turning point for the implementation of the IBL strategy; Wu et al. [10] proposed a method to provide intermittent priority for dedicated bus lanes and analyzed the influence of departure frequency on delays; in terms of signal correlation control, Guler et al. [11] proposed a similar advance signal control strategy of intermittent bus lanes which is to install auxiliary signal lights in the upstream and downstream of the main line signal to control the operation mode of the bus; Ma and Xu [12] proposed a bus priority strategy and gave a green wave coordination control method for the bus operation line; Chiabaut and Barcet [13] evaluated the impact of the intermittent bus lane strategy on traffic conditions and pointed out that the travel time of buses will be significantly reduced when combined with bus signals. In summary, the current research on intermittent bus lanes is not thorough enough. Previous studies mostly focus on the setting of bus lanes and the improvement of driving rules and less consider the impact of intermittent bus lanes on associated intersection timing. This paper considers the effect of intermittent bus lanes on the coordinated control effect of downstream intersections, optimizes the signal timing with the goal of maximum social vehicle carrying capacity and minimum delay of social vehicle intersections, and explores the changing law of the maximum carrying capacity in different scenarios based on microsimulation.

This article consists of the following parts. The first part introduces the timing optimization model under the influence of social vehicles, including the functional relationship between social vehicle carrying capacity and social vehicle arrival rate, bus distribution and downstream intersection timing plan, and the construction of a two-level programming model; the second part is the simulation analysis part, including the carrying capacity analysis under different scenarios solved by the genetic

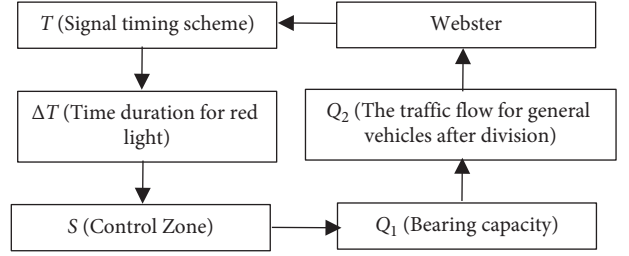


FIGURE 2: The constraint graph for the control zone of the intermittent bus lane and signal timing.

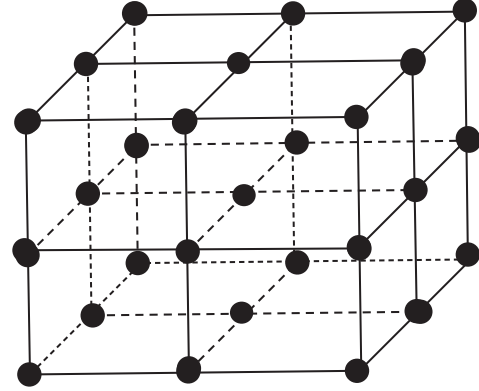


FIGURE 3: The principle for orthogonal experimental design.

algorithm; the third part summarizes the findings of this article.

2. Signal Timing Optimization Model considering the Influence of Social Vehicles on Intermittent Bus Lanes

2.1. Bearing Capacity Analysis for General Vehicles. As shown in Figure 1, the control zone of the intermittent bus lane will divert the traffic flow for general vehicles, which has a bearing capacity

$$\begin{cases} Q_1 = \sum_i^{n-1} q_i, \\ q_i = \frac{s_i - S}{L}. \end{cases} \quad (1)$$

Among them, n refers to the bus quantity within one hour, q_i represents the maximum quantity for general vehicles that can accommodate between the i^{th} and the $i+1^{\text{th}}$ bus, while s_i refers to the space in between the i^{th} and the $i+1^{\text{th}}$ bus, S refers to the length of the control zone where the social vehicle cannot access, and L refers to the space between vehicles.

As shown in Figure 2, the signal timing scheme for intersection will affect the length S of the control zone for the intermittent bus lane, and the change of S will affect the bearing capacity Q_1 for general vehicles on the mentioned lane, while the change Q_1 will have an impact on the traffic

TABLE 1: Calculated experimental results 1.

Q	$s_i = 3$ min	$s_i = 5$ min	$s_i = 1$ min
300	0.093333	0.12	0.133333
600	0.173333	0.186667	0.193333
900	0.168889	0.173333	0.182222
1200	0.2	0.22	0.23
1500	0.216	0.218667	0.234667
1800	0.228889	0.251111	0.248889
2100	0.224762	0.238095	0.249524
2400	0.275	0.278333	0.281667

flow Q_2 for the original lane of general vehicles so that generates influences for the timing of the intersection. So, there is a mutually restrictive relation between signal timing of downstream intersection and bearing capacity for general vehicles on the bus lane.

In order to acquire the functional relationship of bearing capacity and arrival rate for general vehicles on the bus lane and bus allocation and timing scheme for downstream intersection, the paper adopts the orthogonal experiment to optimize the execution efficiency of the algorithm.

The orthogonal experimental method is a design approach to study multiple factors and levels. It selects part of the typical points from the comprehensive experiment according to orthogonality to conduct the experiment. These typical points have features of even dispersion, neat, and comparable, as shown in Figure 3. The orthogonal experimental design is the major approach of fraction factorial design, which is an efficient, rapid, and economical experimental design method.

Various combinations of (Q, s_i, λ) are, respectively, selected through the orthogonal experiment to conduct multiple simulating calculations, and Q_1 is, respectively, calculated. The combinations for (Q, s_i, λ) are shown as follows:

$$\left\{ \begin{array}{l} Q = [300, 600, 900, 1200, 1500, 1800, 2100, 2400] \left(\frac{\text{Veh}}{h} \right), \\ s_i = [180, 300, 600] (s), \\ \lambda = [0.3, 0.5, 0.7] (\%). \end{array} \right. \quad (2)$$

Among them, λ stands for split; the calculated experimental results are given in Tables 1–3.

- (1) When cycle $T = 72$ s and split = 36/36, i.e., $\lambda = 0.5$
- (2) When cycle $T = 72$ s and split = 21/51, i.e., $\lambda = 0.3$
- (3) When cycle $T = 72$ s and split = 51/21, i.e., $\lambda = 0.7$

As shown in Figure 4, analysis conclusions are as follows:

- (1) Under the critical saturation state ($\lambda = 0.5$) and undersaturated condition, with the increase in traffic flow Q for general vehicles, Q_1 , the bearing capacity for general vehicles on the intermittent bus lane is in an upward trend, and compared with

the undersaturated condition, the bearing capacity is more for the critical saturation state.

- (2) Under the hypersaturated state ($\lambda = 0.3$), with the increase in traffic flow Q for general vehicles, Q_1 , the bearing capacity for general vehicles on the intermittent bus lane increases slightly, but when it exceeds the saturation flow rate under the current timing scheme, the algorithm of intermittent bus lane control fails, and Q_1 is in a downward trend.
- (3) With the increase in s_i , the bus departure interval, Q_1 , and the traffic flow carried on the general vehicles on the intermittent bus lane are in an upward trend.

In order to obtain the constraint relation for dependent variable Q_1 and independent variable (Q, s_i, λ) , the fitting function for its relevance is acquired through SPSS fitting, and the results are shown in Table 4. Among them, Beta refers to the standardization coefficient.

Then, the standardized regression equation is obtained as the following:

$$Q_1 = 0.893Q + 0.094s_i - 0.204\lambda. \quad (3)$$

2.2. Two-Level Programming Model Construction. Aiming to maximize the bearing capacity for general vehicles on the intermittent bus lane and minimize the traffic delays of general vehicles at the intersection, a double-layer planning model has been established in this paper, as shown in Figure 5.

2.2.1. Upper-Layer Model. Control layer for bearing capacity of general vehicles on the bus lane:

In order to improve the utilization efficiency of the intermittent bus lane, it requires to obtain $Q_{1\max}$ without impact on bus running.

As known from formula (1),

$$Q_1 = f(\Delta t, s_i) = \sum_i^{n-1} \frac{S_i(v_2 - v_1 - Vv_2\Delta t)}{L(v_2 - v_1)}. \quad (4)$$

Among them, $Q_{1\max}$ stands for the maximum bearing capacity; s_i in formula (4) will be affected by the bus departure interval; therefore, the fixed departure interval can be treated as the known quantity; therefore, the major factor affecting Q_1 is Δt , so formula (4) can be similarly updated to

$$\begin{aligned} Q_1 &= f(\Delta t), \\ \Delta t &< \frac{S_i(v_2 - v_1)}{Vv_2}. \end{aligned} \quad (5)$$

So, the control target for the bearing capacity for general vehicles on the bus lane on the control layer will be

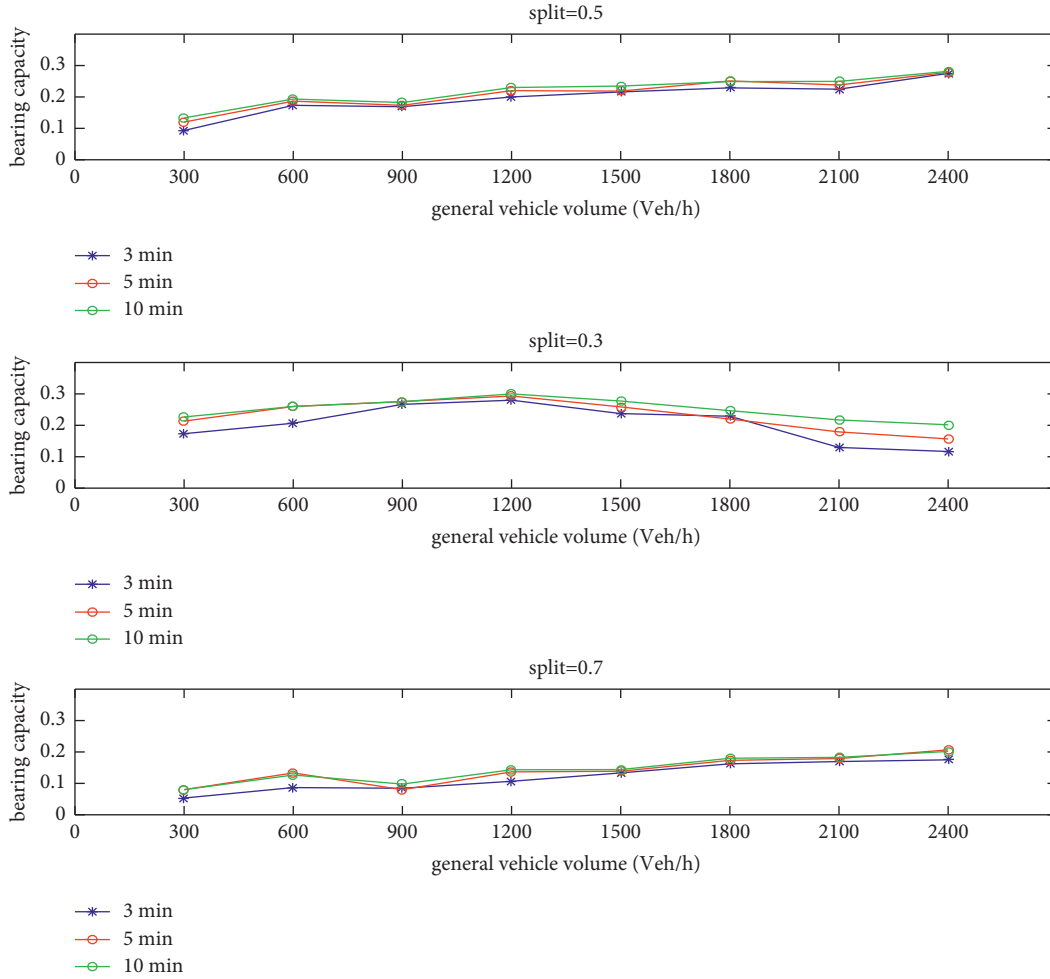


FIGURE 4: Analysis on bearing capacity for general vehicles on the intermittent bus lane.

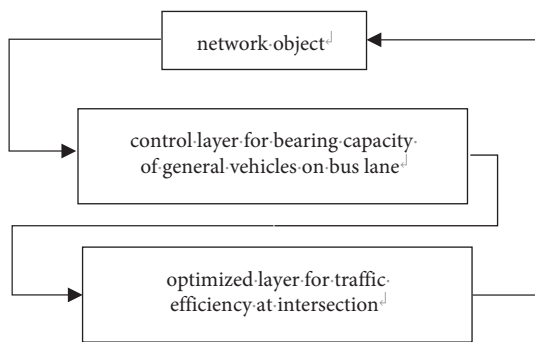


FIGURE 5: Structural diagram of the double-layer planning model.

$$\begin{cases} J_1 = \max(Q_1), \\ \text{s.t. } \Delta t < \frac{S_i(v_2 - v_1)}{Vv_2}. \end{cases} \quad (6)$$

Therefore, the input of this layer will be the signal control strategy of the intersection (target-oriented time duration of red light Δt), and the output will be $Q_{1\max}$.

2.2.2. Lower-Layer Model. Optimized layer for traffic efficiency at the intersection:

After the traffic flow is diverted through $Q_{1\max}$, the traffic flow for general vehicles $Q_2 = Q - Q_1$; at this moment, timing optimization shall be conducted according to Webster.

The bearing capacity for general vehicles on the bus lane can be improved to an extent by changing the signal strategy of downstream intersection; however, the change of split will inevitably affect the vehicle delay of that intersection; therefore, a quantitative analysis on impact degree shall be required. Currently, the access to intersection delay mainly is from the theoretical-analytical method and simulation method. The former is generally used to obtain the delay model through deduction based on definite number theory or vehicle dynamics theory. The latter extracts the relevant parameters with the help of the corresponding model established by microtraffic simulation software. In an effort to acquire detailed and comprehensive data evaluation, the simulation method is selected as the major means to evaluate the impact degree for downstream intersection.

So, the $Q_{1\max}$ output of the upper layer will be treated as the input of this layer, and the optimized control scheme will

TABLE 2: Calculated experimental results 2.

Q	$S_i = 3$ min	$S_i = 5$ min	$S_i = 1$ min
300	0.173333	0.213333	0.226667
600	0.206667	0.26	0.26
900	0.266667	0.275556	0.275556
1200	0.28	0.293333	0.3
1500	0.237333	0.258667	0.277333
1800	0.228889	0.22	0.246667
2100	0.129524	0.179048	0.217143
2400	0.116667	0.156667	0.201667

TABLE 3: Calculated experimental results 3.

Q	$S_i = 3$ min	$S_i = 5$ min	$S_i = 1$ min
300	0.053333	0.08	0.08
600	0.086667	0.133333	0.126667
900	0.084444	0.08	0.097778
1200	0.106667	0.136667	0.143333
1500	0.133333	0.138667	0.144
1800	0.162222	0.173333	0.18
2100	0.169524	0.179048	0.182857
2400	0.175	0.206667	0.201667

be obtained through Webster timing algorithm with the help of the simulation model to conduct simulation analysis on the delay of general vehicles on the road section so as to estimate the pros and cons for the modified timing scheme and feedback it to the upper layer as the input.

Therefore, the objective function of this layer will be

$$J_2 = \min(h(Q_{1\max})). \quad (7)$$

Through the iterative optimization of the double-layer planning model, on the premise that without affecting the bus passage efficiency to obtain the optimized effect for the passage of general vehicles, an optimization merit function is required to be established to evaluate the results of double-layer planning:

- (1) As known from formula (4), under the perfect state, Q_1 is equal to the value when $\Delta t = 0$, so make $C_1 = J_1/f(0)$, which means that the larger the bearing capacity, the closer to 1 for C_1 ; otherwise, C_1 will be closer to 0
- (2) As known from formula (7), when $Q_1 = 0$, the bearing capacity for general vehicles is 0, and the quantity of such vehicles on the general vehicle lane is the highest, so make $C_2 = J_2/h(0)$, which means that the bigger the vehicle delay, the closer to 1 for C_2 ; otherwise, C_2 will be closer to 0

To sum up, the optimization merit function will be

$$C = \alpha C_1 + \beta C_2. \quad (8)$$

Among them, α, β refer to the weight coefficient, and C refers to the evaluation index.

According to the genetic algorithm to solve $Q_{1\max}$ under the multiscene state and its corresponding intersection signal control strategy, the solving steps for the genetic algorithm shall be as follows:

Step 1: establish the optimized model and experimental calculation model.

Step 2: optimize the variable and constraint condition, the variable shall be $Q, s_i, \Delta t$, and Q_1 , and please check constraint conditions on the preceding text.

Step 3: determine the encoding method and use the real number encoding method.

Step 4: determine the individual evaluating method. The fitness function is the objective function, which is also the acquired fitting function.

Step 5: design the genetic operator. Use the proportional selection operator for select operation, use the single-point crossover operator for crossover operation, and use the fundamental bit mutation operator for mutation operation.

Step 6: determine the operating parameter for genetic algorithm, M stands for the population, G refers to iterations, P_c represents the crossover probability, and P_m stands for the mutation probability.

3. Simulation Verification

After the above process, $Q_{1\max}$ under the multiscene state and evaluation index is solved, and the simulation verification is conducted. Assuming the weight coefficient α, β are both 0.5, the analyzed results are as the following:

- (1) As shown in Table 5, when the traffic flow for general vehicles is 1500 Veh/h and the bus departure interval is 5 minutes:

Under this scene, the 2nd scheme marked as the black border is the maximal solution of bearing capacity. The accuracy rate for the calculated value compared with the simulation value is 84.17%, and the 4th scheme marked as the black border is the optimal solution for the comprehensive evaluation index.

- (2) As shown in Table 6, when the traffic flow for general vehicles is 1500 Veh/h and the bus departure interval is 10 minutes:

Under this scene, the 2nd scheme is the maximal solution of bearing capacity. The accuracy rate for the calculated value compared with the simulation value is 87.99%, and the 4th scheme is the optimal solution for the comprehensive evaluation index.

- (3) As shown in Table 7, when the traffic flow for general vehicles is 2100 Veh/h and the bus departure interval is 5 minutes:

TABLE 4: Fitting process.

Model	B	Standard error	Beta	t	Significance
Constant	12.341	8.579	0	1.438	0.155
Λ	-52.604	12.252	-0.204	-4.293	0.000
Departure interval	0.022	0.011	0.094	1.985	0.051
Q	0.055	0.003	0.893	18.815	0.000

TABLE 5: General vehicles are 1500 Veh/h and the bus departure interval is 5 minutes (keep two decimal places).

No.	Split	Calculated value for load bearing ratio	Simulation value for load bearing ratio	Bearing capacity	Average vehicle delay	c_1	c_2	Evaluation index
1	0.2	0.22	0.27	397.77	24.62	0.29	0.89	-0.30
2	0.3	0.26	0.31	460.95	23.98	0.34	0.87	-0.26
3	0.4	0.17	0.20	298.73	27.65	0.22	1.00	-0.39
4	0.5	0.22	0.24	352.77	17.65	0.26	0.64	-0.18
5	0.6	0.23	0.25	367.72	18.99	0.27	0.69	-0.21
6	0.7	0.14	0.17	248.42	21.65	0.18	0.78	-0.30
7	0.8	0.07	0.11	171.69	23.47	0.13	0.85	-0.36

TABLE 6: General vehicles are 1500 Veh/h and the bus departure interval is 10 minutes (keep two decimal places).

No.	Split	Calculated value for load bearing ratio	Simulation value for load bearing ratio	Bearing capacity	Average vehicle delay	c_1	c_2	Evaluation index
1	0.2	0.22	0.24	353.67	25.33	0.25	0.92	-0.33
2	0.3	0.28	0.32	472.75	24.12	0.34	0.87	-0.27
3	0.4	0.22	0.26	393.15	27.31	0.28	0.99	-0.35
4	0.5	0.23	0.28	418.78	18.79	0.30	0.68	-0.19
5	0.6	0.20	0.23	351.99	21.33	0.25	0.77	-0.26
6	0.7	0.14	0.17	248.91	23.33	0.18	0.84	-0.33
7	0.8	0.08	0.09	140.70	26.32	0.10	0.95	-0.43

TABLE 7: General vehicles are 2100 Veh/h and the bus departure interval is 5 minutes (keep two decimal places).

No.	Split	Calculated value for load bearing ratio	Simulation value for load bearing ratio	Bearing capacity	Average vehicle delay	c_1	c_2	Evaluation index
1	0.2	0.10	0.14	285.86	25.39	0.15	0.69	-0.27
2	0.3	0.18	0.19	395.76	25.53	0.21	0.69	-0.24
3	0.4	0.16	0.18	384.98	29.41	0.27	0.80	-0.30
4	0.5	0.24	0.24	505.26	19.15	0.20	0.52	-0.13
5	0.6	0.26	0.29	606.34	20.23	0.32	0.55	-0.12
6	0.7	0.18	0.21	443.30	23.52	0.23	0.64	-0.20
7	0.8	0.14	0.18	377.62	25.36	0.20	0.69	-0.25

Under this scene, the 5th scheme is the maximal solution of bearing capacity. The accuracy rate for the calculated value compared with the simulation value is 89.76%, and the 5th scheme is the optimal solution for the comprehensive evaluation index.

4. Conclusion

Previous studies mostly focus on the setting of bus lanes and the improvement of driving rules and less consider the impact of intermittent bus lanes on associated intersection timing. This paper considers the effect of intermittent bus lanes on the coordinated control effect of downstream intersections.

Taking the social vehicle carrying capacity as the starting point, this paper proposes a collaborative control method for

intermittent bus lanes and downstream intersections and analyzes the functional relationship between the social vehicle carrying capacity and the social vehicle arrival rate, the distribution of public transport vehicles, and the downstream intersection timing plan. A two-level planning model with the largest social vehicle carrying capacity and minimum traffic delay at social vehicle intersections is constructed, and the maximum solution of the carrying capacity in different scenarios is verified through simulation.

Data Availability

The data can be acquired by contacting the corresponding author through e-mail.

Conflicts of Interest

The authors declare that they have no conflicts of interest.

Acknowledgments

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