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# Truck platooning strategy near merge: Heuristic-based solution and optimality conditions

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#### Abstract

Truck platooning aims to form platoon of trucks along freeway corridors to save fuels 2 and increase roadway capacity, but the presence of long platoons is problematic near merges 3 where vehicles from freeway entrance have to make mandatory lane changes. An active pla-4 tooning strategy that deals with merging of conventional vehicles is needed for platooning 5 application in real world. The paper proposes an original approach to split platoon when 6 approaching merging areas. The proposed strategy aims to provide safe and comfortable 7 merging maneuvers for conventional vehicles while maximizing the efficiency for the truck 8 platoon. This is achieved by deciding the position and time of the truck in the platoon that 9 should open a large gap for merging vehicles. The problem is posed, based on reasonable 10 physical and behavioral assumptions of truck platoon dynamics. A heuristic-based solu-11 tion is proposed, and its optimality is verified through an optimization-based strategy. The 12 strategy can deal with both individual merging and merging of a small platoon of vehicles. 13 Applicability of the proposed solution is demonstrated via examples. 14

1

#### 1 INTRODUCTION

<sup>2</sup> Vehicle automation is seen as one of the promising solutions to today's traffic problems since it

<sup>3</sup> will revolutionize the way we operate our vehicles today [1]. However, it is also acknowledged

<sup>4</sup> that individual automation can hardly bring benefits to collective traffic systems, whiles their

<sup>5</sup> connected automated vehicles (CAV) pose more potential in improving traffic operations [2].

<sup>6</sup> Vehicle platooning is a highway CAV application characterized by a string of vehicles <sup>7</sup> keeping short spacing with Vehicle-to-Vehicle (V2V) communication [3, 5, 6]. Vehicle platoon-<sup>8</sup> ing is not a new concept. In the U.S., PATH started the research on automated platoons more <sup>9</sup> than two decades ago, with a public demonstration of vehicle platooning on a special track in <sup>10</sup> San Diego in 1997 [7]. From there onward, PATH continued this line of research and recently <sup>11</sup> experimented a string Cooperative Adaptive Cruise Control vehicles on public highway in 2013 <sup>12</sup> [8].

As a subclass of vehicle platooning problem, truck platooning has received much at-13 tention recently. Technically, truck platooning is more challenging compared to car platooning 14 due to the complex truck dynamics. From implementation perspective, truck platooning is more 15 likely to happen before platooning of individual cars due to the pronounced benefits of fuel saving 16 and more mature business models [3]. In Europe, several projects and initiatives were conducted 17 that aimed at putting truck/vehicle platooning on pubic roads, including the Safe Road Trains for 18 the Environment (SARTRE) project [9], the COMPANION project [10], the Grand Cooperative 19 Driving Challenge (GCDC) [11], and the Truck Platooning Challenge [12]. Truck platooning 20 initiatives have been reported in the U.S. and Japan [13]. 21

One of the lessons learned from the existing truck platooning projects is problems that large platoons may bring at freeway entrances and exits [3, 12]. How to handle vehicles merging while long platoons are passing the merging area is an intriguing question for both researchers and practitioners. This work deals with the design of truck platooning strategy at merges to facilitate smooth merging.

#### 27 Relevant work in literature

There are many technical challenges with truck/vehicle platooning, including environment perception, reliable communication, platooning coordination and vehicle control [1, 4]. In view of platooning coordination and control, several studies discussed the system control architecture involving automated vehicle platoons, most of which pertain to a hierarchical setting [4, 5]. Often a coordination layer is placed between the traffic control layer and the vehicle control layer, dealing with trajectory planning and coordination among platoons [4, 5].

Literature has been focusing on vehicle control layer design for platoons. Different control approaches have been used to design vehicle longitudinal control systems. String stability and collision avoidance have attracted considerable attention, addressing the problems of how the controller can attenuate disturbance propagation along the platoon [14] and how to combine vehicle following with collision avoidance mechanism [6].

A few researchers have designed maneuver strategies at the coordination layer. A set of protocols for highway maneuvers of platoons was proposed in [15], including platoon merge, platoon split, and lane change. The design of the protocol is based on a finite state description of the platoon maneuvers, giving the commands from the upper level traffic control layer. While acknowledging the pioneering role of this work, the design was not aimed at generating decisions
 of when and where to split a platoon at highway entrance and was based on fully automated
 vehicle environment.

In [16], entry and exit maneuvers of platoons on highway were discussed. Strategies were proposed that were applicable in highways with dedicated automated vehicle lanes and transitional lanes near entry and exit. The design was based on the assumption that the mergrog vehicle is a CAV and it required changes of infrastructure, e.g. a parallel transition lane or dedicated ramps, raising concerns over its applicability in reality.

In [5], two basic platoon maneuver strategies, merge and split, were proposed to facilitate another automated vehicle joining an existing platoon and a platoon member leaving the platoon respectively. The split strategy was further elaborated by sub-tasks of initiating split request, creating safe gap and changing lane. However, when is optimal to start the gap creation process and how the transient maneuver looks like were not formulated.

More recently, a finite state machine approach was also reported in [17] for platoon maneuver protocols. The protocols were combined with CACC control logic was used to represent longitudinal behavior. An interesting approach was presented in [18], where a spring-massdamper analogy was adopted to describe platooning dynamics. This modeling approach allows derivation of efficient platooning strategies at entry and exit by controlling the spring constant and damping coefficient. It can capture different scenarios where an automated vehicle join or leave platoons.

Notice that another body of literature focused on platoon formation strategies [19, 20]. We restrict the discussion on platoon formation because this paper concentrates on how to split a platoon rather than forming a platoon.

Literature shows that quite some effort in defining platoon maneuver protocols at high-24 way entry and exit. These studies focus on dynamics and interactions between platoons or be-25 tween a platoon and an individual CAV, which implies communication between interacting pla-26 toons/vehicles. Some even requires additional changes in the infrastructure, which may impede 27 the near-term application of the strategies. In addition, there is a gap between finite state de-28 scription of the platoon maneuvers and the detailed operational truck platooning strategies for 29 the transition between states. In case of truck platooning, it is likely that the platoon has to be de-30 tached to facilitate merging vehicles at on-ramp sections. A decision-making strategy to support 31 when and where to split the truck platoon is yet to be explored. 32

To this end, the paper proposes an original approach to split platoon approaching merging areas. The split strategy aims to provide safe and comfortable merging maneuvers while restricting the disturbance for the platoon. The problem is posed, based on reasonable physical and behavioral assumptions about string-stable vehicle following dynamics. A heuristic-based solution and optimization-based solution are proposed based on simplified car-following model for platoons, which enables us deriving the vehicle index and time to yield a gap analytically. The performance of the strategies is verified with simulation.

In the remainder of the paper, we first present the vehicle-following model for platoons, followed by the formulation of the decision-making strategy and its optimality verification. After that, we apply the strategy to derive some insights into the relations between model parameters. We summarize the findings and future research in the conclusion section.

#### **1 MODEL FOR PLATOON DYNAMICS NEAR MERGE**

#### 2 Vehicle-following model

Vehicle trajectories are described by a Vehicle-Following model, also referred to as Car-Following (CF) model. In the paper, we assume the design of longitudinal vehicle control algorithm guarantees string stability of the truck platoon and the Newell model is considered [21] for the CF model. It consists in a piece-wise linear speed-headway relationship, which is consistent with the macroscopic kinematic wave model originally proposed in [22, 23]. Several arguments are in favor of this model for the study : simple but not simplistic representation of first-order platoon dynamics; limited number (three) and observability of model parameters; ability to describe car-following steady states; numerous prior works on vehicle trajectory-based calibration and validation. In the paper, the model is supposed to describe the platoons steady states, *i.e.* when the platoon is formed with no disturbance to the trucks time-gap policy. It assumes that under normal car-following situations, the speed of the following truck is adjusted with respect the distance to its leader. The speed-headway relationship is defined based on three parameters: *u* the free-flow speed, *w* the maximum wave speed and  $\kappa$ .

$$v_i^{t+1} = \min\left(u, (s_i^t - \frac{1}{\kappa}) \cdot w \cdot \kappa\right) \tag{1}$$

Notice that the minimum time headway h is determined as follows :

$$h = \frac{1}{\kappa} \cdot \frac{w + u}{w \cdot u} \tag{2}$$

<sup>3</sup> Also notice that from a physical perspective :

- $\kappa$  is directly related to the minimum spacing at stop  $s_x = 1/\kappa$  (including the truck length).
- 5  $r=1/(w \cdot \kappa)$  is the reaction time, i.e. a speed variation of the leader will impact the follower

 $_{6}$  trajectory with a time shift *r*.

<sup>7</sup> The car-following behavior can be completed with two additionnal models. First, an acceleration <sup>8</sup> model which bounds the acceleration with a maximum value  $a_x$  [24]. Second, a relaxation model <sup>9</sup> [25, 26] which describes the speed difference  $\varepsilon$  that a follower is willing to accept when its <sup>10</sup> spacing is lower that its equilibrium value. The complete CF model can adress most of the <sup>11</sup> car-following situations with a minimal set of five parameters.

#### 12 Parameters for platooning under constant-time-gap policy

All the five parameters have a physically meaning and default values can easily be proposed. The literature provides many references to refine their calibration, mostly based on empirical trajectories [27, 28]. To the best of authors knowledge, the proposed CF-model has never been calibrated for truck platooning operations. Here we propose basic formulas to calibrate the car-following parameters according to the platooning strategy.

Classically, a Truck-Platooning (TP) strategies consider a target gap g, which can be expressed in time  $(g^t)$  (e.g. the constant time gap policy) or in space  $(g^s)$  (e.g. the constant spacing policy). The gap corresponds to the time or space difference between the front bumper of the following current truck and the rear bumber of its leader. In the remaining we consider the time gap, but identical results can be drawn by considering the space gap instead.



Figure 1: Fundamental diagram

The speed-spacing function of the CF model has to be calibrated with respect to this gap. In the case of the Newell CF model, only 3 parameters are concerned: u; w and  $\kappa$ . However, u is classically related to the maximum authorized speed on the section, and  $\kappa$  is constrained by the length of the vehicle L. Consequently, the maximum wave speed w is the parameter to be adjusted according to the TP strategy.

Considering the length of a truck L and the minimum time gap  $g^t$ , the minimum time headway during truck platooning operation writes:

$$h^p = g^t + L/u \tag{3}$$

the corresponding space headway is  $s^p = u \cdot g^t + L$ . Thus, the maximum wave speed adjusted for TP strategy becomes :

$$w^{p} = \frac{u}{u \cdot \kappa \cdot (g^{t} + L/u) - 1}$$

$$\tag{4}$$

Notice that this equation holds if  $u \cdot \kappa \cdot (g^t + L/u) > 1$ . Consequently the minimum gap g has to respect the following constraint:

$$g^{t} > \frac{1}{u} \cdot \left(\frac{1}{\kappa} - L\right) \tag{5}$$

<sup>1</sup> This condition imposes a minimum gap between trucks according to their car-following proper-<sup>2</sup> ties.

**Remark** It should be noted that under platooning operation, the reaction time  $r^p = 1/(w^p \cdot \kappa)$ of truck is (or should be) highly decreased by the raising of its maximum wave speed.

#### 1 Platoon dynamics due to merge

When a vehicle is about to merge from the on-ramp, a truck will decrease its speed to open a gap for the merging vehicle. We propose to process the speed of the complying truck considering relaxation. Thus, the complying truck will accept a speed lower than its leader, such that the gap will progressively increase. It provides the advantage of simplicity, it accounts for the speed of the leading truck and it rely on a two physical parameters:

- ε, the speed difference with the predecessor during the relaxation period
  - $a_x$ , the maximum acceleration rate at the end of the relaxation period.
- 8 9

17

7

The CF model is modified accordingly and the different model formulations from [24, 25, 26, 28] can be combined as follow:

$$v_{i}^{t+1} = \min\left(v_{i,dem}^{t+1}, v_{i,sup}^{t+1}\right)$$
(6)

where

$$\begin{cases} v_{i,dem}^{t+1} = max(u, v_i^t + a_x \cdot dt) \\ v_{i,sup}^{t+1} = \begin{cases} v_{i-1}^t - \varepsilon & \text{if relaxation is active} \\ (s_i^t - \frac{1}{\kappa}) \cdot w \cdot \kappa & \text{if not} \end{cases}$$
(7)

Note that the time step must be set as :  $\delta t = 1/w \cdot \kappa$ . The process is illustrated in Figure 2. On the left side, the platoon is composed of 10 trucks crosses the stretch of road at the free flow speed u = 20m/s with a constant time gap  $g^p = 0.5$  s between every trucks. On the right side on the figure, the fifth truck ( $I_n = 5$ ) decreases its speed between t = 30s and t = 60s, with a speed difference  $\varepsilon = 1$ m/s. Then the truck re-accelerate at the rate  $a_x$  to retrieve the free-flow speed. During this period, a gap is formed and the final spacing headway between the forth and fifth trucks reaches s = 60m.

At this stage, some issues are raised. How to choose the truck that must comply by decreasing its speed? How to estimate the starting time of the complying maneuver? These problems are posed and analytical (heuristic) solutions are proposed in the next section.

# 21 DESIGN OF PLATOON SPLIT STRATEGY

Without anticipation of merging maneuvers, the presence of platoons involves safety issues and 22 traffic disturbances. In Figure 2, a platoon of 10 trucks crosses a road stretch (3km). A vehicle 23 merges at the time-position t = 60s, x = 1000m (trajectory not represented for a better readabil-24 ity). On the left picture, the platoon does not anticipate the merging maneuver: the vehicle 25 merges in a short space, which raises comfort and safety issues, and immediate following truck 26 behind the merging vehicle may over-react and trigger disturbance for the surrounding traffic. 27 On the right picture, the platoon anticipates the merging maneuver : the seventh truck decreases 28 its speed far upstream the merge, so that a gap is created. The vehicle merges in comfortable and 29 safety conditions, and the disturbance for surrounding traffic on the carriageway is smoothed. 30 The main objective of the platoon strategy is to determine the truck index in the platoon 31 that should yield a gap for the merging vehicle, denoted by  $i^{yield}$  and the time instant that the 32



Figure 2: Platoon trajectories without splitting (left) and with splitting (right)

<sup>1</sup> gap creation process starts, denoted by  $t^{yield}$  in real time, so that merging vehicles can merge

<sup>2</sup> smoothly onto the main carriageway. Thus the decision variables are:  $\mathbf{d} = (i^{\text{yield}}, T_a)$ .

# **3 Operational assumptions**

<sup>4</sup> The design of the platooning strategy at merges is based on several assumptions. In particular,
 <sup>5</sup> we assume that:

• trucks in the platoon follow their leader with a constant time gap  $g^t$ , corresponding to 7 a time headway  $h^p = g^t + L/u$ ;

conventional vehicles from on-ramp merge at the same speed of the platoon, denoted
 *u*;

• the truck platoon leader has the knowledge of the time  $t^{\text{merge}}$  that the merging vehicles start to move to the main carriageway from the acceleration lane. This can be assisted by a roadside system that detects the position and speed of the merging vehicle;

• the truck platoon leader decides which truck in the platoon should open a gap to ac-

13

1 commodate the merging vehicles and when it should do so. Trucks in the platoon follow the

- <sup>2</sup> decisions of the truck platoon leader;
  - the acceleration for trucks is bounded, denoted  $a_x$ ;

• the merging is performed in a relatively smooth way, e.g. no emergency braking will be

needed for the trucks and merging cars. The merging process model is described in the previous
 section.

# 7 Heuristics-based strategy

<sup>8</sup> The problem is posed in Figure 3, and a heuristic solution is proposed to estimation the estimating <sup>9</sup> the yielding truck index  $i^{yield}$ , the anticipation time  $T_a$  and the speed difference  $\varepsilon$ . Recipes for <sup>10</sup> each variable to estimate are presented in paragraphs below.

# 11 Solution for i<sup>yield</sup>

3

4

We start with the heuristic method that based on the *first-in-first-out* (FIFO) principle, i.e. for all vehicles involved in the merging process, the passing sequence at the merging point is determined by the predicted arrival time  $t_i^{\text{arrive}}$  at the fixed merging point  $X_m$ . The arrival time is determined by the *constant speed heuristics*, *i.e.* vehicles will maintain their current speed in the near future, thus we have:

$$t_i^{\text{arrive}}(t) = \frac{X_m - x_i(t)}{v_i(t)}$$
(8)

Thus we can determine the yielding truck index (increasing in the upstream direction) as:

$$i^{\text{yield}} = i \in \left[ t_{i-1}^{\text{arrive}}(t) < T_m < t_i^{\text{arrive}}(t) \right]$$
(9)

Since the truck index in the platoon is an ordered set, the uniqueness of the solution (9) is guar anteed.

# <sup>14</sup> Solution for $T_a$

After determining the yielding vehicle index, the time that the truck starts to yield must be determined. Some empirical evidence shows that it takes around 20 to 40 seconds for a truck to split from a platoon [9]. This is consistent with the duration of relaxation process after merge [28]. Thus we choose to command the designated truck starting to yield gap at the time  $T^{\text{yield}}$  before the merging vehicle moves onto the mainline:

$$T^{\text{yield}} = T_m - T_a \tag{10}$$

where  $T_a$  is the anticipation time before the merging maneuvers. The objective is to formulate

anticipation time with respect the to decision variables, i.e. the time that a truck needs to decrease their speed to open a gap  $[T^{\text{yield}}, t_1]$ , and then to accelerate to come back to its initial speed  $[t_1, T_m]$ .

their speed to open a gap  $[T^{\text{yield}}, t_1]$ , and then to accelerate to come back to its initial speed  $[t_1, T_1]$ Figure 3 shows that two time periods have to be considered separately.



Figure 3: Heuristic-based decision : problem and parameters

**Recipe for**  $t_1$  During the acceleration period, the following truck accelerates from the speed  $u - \varepsilon$  to reach the free-flow speed u. Assuming a constant acceleration rate  $a_x$ , it gives:

$$t_1 = T_m - \frac{\varepsilon}{a_x} \tag{11}$$

**Recipe for** *T*<sup>**yield**</sup> From Figure 3

$$u \cdot (g^t + T_a) = (u - \varepsilon) \cdot (t_1 - T^{\text{yield}}) + \int_{t_1}^{T_m} \int_{t_1}^{T_m} a_x \cdot dt + S^c$$
(12)

where  $S^c = S_m^c(v) + S_f^c(v)$ . It follows from Equations 11 and 12 that:

$$T_a = \frac{S^c - h^p \cdot u}{\varepsilon} + \frac{\varepsilon}{2 \cdot a_x}$$
(13)

<sup>1</sup> Solution for  $\varepsilon$ 

In the previous section, the optimal anticipation time is the decision variable to set, assuming a given  $\varepsilon$ . However, in reality, the platoon maybe be informed of the merging time from a road side unit, where the only decision variable is the speed difference  $\varepsilon$ . Consequently, the problem is re-formulated to find the optimal  $\varepsilon$  for a given anticipation time  $T_a = T_m - T^{\text{yield}}$ . To solve this problem, Equation 13 gives:

$$\frac{\varepsilon}{2 \cdot a_x} - T_a + \frac{S^c - h^p \cdot u}{\varepsilon} = 0$$

$$\Leftrightarrow \frac{\varepsilon^2}{2 \cdot a_x} - T_a \cdot \varepsilon + (S^c - h^p \cdot u) = 0$$
(14)

A positive solution exists for Equation 14 if (and only if)  $T_a > \sqrt{\frac{2 \cdot (S^c - h^p \cdot u)}{a_x}}$ . The solution is:

$$\varepsilon^{+} = a_x \cdot T_a \cdot \left( 1 - \sqrt{1 - \frac{2 \cdot (S^c - h^p \cdot u)}{T_a^2 \cdot a_x}} \right)$$
(15)

Equation 15 is easy to implement, but the importance of each parameter is not explicit. We propose to derive a second order Taylor expansion to bring out high (first order) and low (second order) importance parameter.

$$\hat{\varepsilon} = \frac{S^c - h^p \cdot u}{T_a} + \frac{1}{2} \cdot \frac{(S^c - h^p \cdot u)^2}{T_a^3 \cdot a_x}$$

$$= \frac{S^c - h^p \cdot u}{T_a} \left( 1 + \frac{1}{2} \cdot \frac{S^c - h^p \cdot u}{T_a^2 \cdot a_x} \right)$$
(16)

<sup>2</sup> Equation 16 demonstrate that the anticipation time  $T_a$  plays a major role while the acceleration <sup>3</sup> rate  $a_x$  has a minor impact on  $\varepsilon$ .

It should be noted here that *S* is a critical spacing composed of  $S_m^c(v)$ , critical space headways for the merging vehicle, and  $S_f^c(v)$ , critical spacing for the following truck. The solution can be easily adapted for multiple merging maneuvers, when a platoon of *N* vehicles needs to merge on the carriageway. In this case, The solution basically considers the critical spacing for a platoon of *N* vehicles  $S^c(v, N) = N \cdot S^c(v)$ . Then the critical spacing  $S^c$  becomes:  $S^c = S_n^c(v, N) + S_f^c(v)$ .

#### 9 Equivalence to an optimization-based strategy

<sup>10</sup> In this section, we show that the heuristic-based solution is equivalent to an optimization-based

strategy. Recall the general objective of the platoon split strategy: opening a sufficient gap within

<sup>12</sup> a closely-spaced truck platoon to facilitate comfortable merging of conventional vehicles from

<sup>1</sup> on-ramp. To this end, we formulate the problem as the following mathematical programme, with

<sup>2</sup> objective function:

$$\max_{i^{\text{yield}}, t^{\text{yield}}} \sum_{j=1}^{N} q_j^{T_m} \equiv \max_{i^{\text{yield}}, t^{\text{yield}}} \sum_{j=1}^{N} \frac{v_j^{T_m}}{s_j^{T_m} + L}$$
(17)

<sup>3</sup> where *N* is the total number of trucks in the platoon and  $q_i(T_m)$  is the *local flux* for vehicle *i*.

<sup>4</sup> The optimal decisions are subject to some physical and behavioral constraints, including:

• The car-following dynamics in normal conditions, for truck platoons and during merg-6 ing, see Section 2.

• Safe merge: at the time of merge, the yielding truck should keep a spacing with respect to the merging vehicle no less than the normal vehicle- following spacing:

$$s_{i^{\text{yield}}}^{T_m} \ge s^t \tag{18}$$

• Bounds on speed: the vehicle speeds are bounded by the zero speed and free speed *u*;

$$0 \le v_i(t) \le u \tag{19}$$

• Limited acceleration capability;

$$\dot{v}_i(t) \le a_x \tag{20}$$

The formulation entails that the optimal maneuver strategy aims at maximizing the flux
 at the time of merging while respecting physical and behavioral constraints.

Notice that the objective function can be rewritten as:

$$\sum_{j=1}^{N} \frac{v_i^{T_m}}{s_i^{T_m} + L} = \sum_{j=1}^{i^{yield}} \frac{1}{g^t + L/u} + \frac{v_{i^{yield}}^{T_m}}{s_{i^{yield}}^{T_m} + L} + \sum_{j=i^{yield}}^{N} \frac{1}{g^t + L/v_j}$$
(21)

<sup>9</sup> The first term in the right hand side (RHS) of Equation 21 is at its maximum flux since <sup>10</sup>  $v_j \le u$  and we would like as many truck passing the merging vehicle as possible. But the safety <sup>11</sup> constraint restricts the number to the first truck in the platoon that would arrive at the merging <sup>12</sup> point later than the merging vehicle at the maximum speed *u*. This gives the same solution for <sup>13</sup>  $i^{yield}$  as in Equation 9. The third term in the RHS of 21 is a decreasing function of  $v_j$  and achieves <sup>14</sup> the maximum when  $v_j = u$ .

The middle term in the RHS of 21 depends on the yielding time  $t^{yield}$ . Let  $\bar{t}^{yield} = T^{yield} + \delta$ , where  $T^{yield}$  is determined by the heuristic method. If  $\delta > 0$ , using the same derivation process as in the heuristic-based method, the spacing of the yielding truck at the time of merge will become  $s^{yield} = s_f + u \cdot \delta$ , while the speed of the yielding truck and those behind the yielding truck at the time of merge is the same as u. Thus the third term of the objective function achieves its maximum but the middle term is smaller than that from the heuristic solution: e.g.  $\frac{u_i}{s_f + u\delta + L} < \frac{u_i}{s_f + L}$ . When  $\delta < 0$ , we can only achieve  $s^{yield} = s_f$  when the acceleration adopted by the yielding truck  $i^{yield}$  is less than  $a_x$ . This implies the speed of the yielding truck at the time of merge is lower than free speed:  $v_{iyield}^{T_m} < u$ , and the second and third term becomes:  $\frac{v_{iyield}^{T_m}}{s_f + L} + \sum_{j=i^{yield}}^{N} \frac{1}{g^t + L/v_{iyield}} < \frac{u}{s_f + L} + \sum_{j=i^{yield}}^{N} \frac{1}{g^t + L/u}$ , which is smaller than that with the heuristic solution. Consequently, we can conclude that *the heuristics-based solution is the optimal solution that maximize the flux at the time of merging conditioned at providing sufficient gap for the conventional vehicle to merge.* 

# 7 APPLICATION

- <sup>8</sup> Illustrative example
- <sup>9</sup> Let consider the following situation:

• a platoon is composed of 10 trucks, moving with a speed u = 20m/s with a time gap policy is  $g^t = 1s$ .

• a merging maneuver has the following parameters :  $V_m = u = 20m/s$  and the merging time  $T_m = 60s$ .

• in case of merging, the yielding truck opens the gap with speed difference of  $\varepsilon = 2m/s$ and then with acceleration at  $a_x = 1m/s^2$ .

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Figure 4a illustrates vehicle trajectories with no anticipation (left) and with the optimal 17 anticipation maneuver (right). According to the heuristic-based strategy proposed in the paper, 18 the optimal solution is :  $i^{yield} = 8$ ,  $T_a = 48s$ . On the right picture, the eighth truck in the platoon 19 starts to decrease its speed at the time  $t = T^{\text{yield}} = 12s$  from 20m/s to 18m/s. It keeps this speed 20 to open the gap until the time  $t_1 = 58s$ , and it accelerates at the rate  $a_x = 1m/s^2$  to return to 21 its free-flow speed. The variation of the space headway with respect to time is illustrated in 22 Figure 4c, where the space headway is gradually increased from h = 40m to h = 125m during 23 the yielding maneuver. Finally, at the time t=60s, the space headway has reached h = 125m, *i.e.* 24 105*m* excluding the truck length. 25

# 26 Decision support chart

<sup>27</sup> The heuristic-based solution can be the basis for designing decision support diagrams. Let as-<sup>28</sup> sume that a platoon of trucks received the following merging information from a road site unit : <sup>29</sup> "a vehicle will merge in 50s from the next on-ramp". With the help of Figure 5(a), the truck will <sup>30</sup> start its maneuvers immediately with a speed difference  $\varepsilon = 2$ m/s. The decision can be adjusted <sup>31</sup> according to the number of vehicle to merge (See Figure 5) and the maximum acceleration rate <sup>32</sup>  $a_x$  of the truck.

# 33 Impact on traffic

It should be noted that the anticipation maneuver smooths the impact of merging maneuvers inside platoon of truck. It should also be noted that the anticipation limits the impact on traffic flow. Indeed, total travel time or total delay for trucks does not depend on the transitional yielding parameters, but it only depends on the number of vehicle(s) that merge, which causes a short

<sup>38</sup> delay to the trucks that follows the merging vehicle(s).

<sup>39</sup> On the contrary, if the merging maneuvers are not anticipated by platoons, one can expect



Figure 4: Platoon trajectories without anticipation (left) and with the heuristic-based decision (right)



Figure 5: Decision support charts for adapting (a) anticipation time  $T_a = f(\varepsilon, N)$ , (b) speed difference  $\varepsilon = f(T_a, N)$  or (c) number of vehicle(s) to merge  $N = f(N, T_a)$ 

merging failures with vehicles stopped at the end of the acceleration lane, or an abrupt decelera tion and over reactions from following trucks. Both cases are known to be the cause of capacity
 drop around merges, with major impact on traffic conditions.

#### 4 CONCLUSION

#### 5 Main contribution

The paper proposes an original solution to split platoon of trucks approaching merging areas.
 The splitting aims to provide a safe and comfortable merging maneuvers while restricting the
 disturbance on the carriageway. The problem is posed, based on reasonable physical and behav-

<sup>9</sup> ioral assumptions. A heuristic-based solution is proposed, which optimizes the flux at the time

of merging while supplying safe gap for the merging vehicles. The proposed solution can be the
 basis for designing efficient and safe splitting strategies for platoons. The paper also provides de-

cision support charts that can be the basis for scaling the anticipation time or the speed difference

<sup>13</sup> of trucks with respect to the number of vehicle(s) to merge.

#### 1 Further research

In the paper, the solution is adapted to platoons of vehicles from the on-ramp merges into a 2 platoon of trucks on the main line. Further research is needed to extend the proposed solution 3 to address several independent merging vehicles. Moreover, it is assumed that vehicles merge 4 at the speed of the platoon, which could be extended for low speed merging maneuvers. And 5 finally, the proposition can be the basis for advanced solutions, where the anticipation time can 6 be combined with a merging control, for instance with ramp-metering strategies. The ramp 7 metering algorithm would control the rate and the speed of the merging maneuvers, and would 8 provide more flexibility framework to improve global safety and comfort indicators, for both 9 trucks and light vehicles. 10

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