



Platoon Forming Algorithms For Intelligent Street Intersections

Rik Timmerman, 02-07-2019 Joint work with Marko Boon

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Applied² Probability Workshop

Outline

- Introduction
- Model description
 - Platoon forming algorithms
 - Speed regulation of vehicles
- Performance analysis
 - Mean delay
 - Fairness
 - Case study
- Conclusions



Self-driving vehicles introduction

Waymo is gearing up to put a lot more self-driving cars on the road

Kirsten Korosec @kirstenkorosec / 3 months ago

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Comment



Self-driving vehicles introduction

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We assume the following

• All vehicles are self-driving.



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- There is a central controller at the intersection.



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- All vehicles are self-driving.
- There is a central controller at the intersection.
- There is a control region around the intersection.
- Speed regulation of vehicles is possible.



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The exhaustive discipline:



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As long as no vehicles are delayed we do not form platoons bigger than size 1.



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until a gap arises

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The gated discipline



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The gated discipline





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$$\begin{split} & \text{MotionSynthesize}(z_{i,k}(t'_0), t'_0, t'_f, y) := \\ & \underset{x: \ [t'_0, t'_f] \to \mathbb{R}}{\arg \min} \quad \int_{t_0}^{t_f} |u(t)| dt \\ & \text{subject to} \quad \ddot{x}(t) = u(t), \text{ for all } t \in [t'_0, t'_f]; \\ & \quad 0 \leq \dot{x}(t) \leq v_m, \text{ for all } t \in [t'_0, t'_f]; \\ & \quad |u(t)| \leq a_m, \text{ for all } t \in [t'_0, t'_f]; \\ & \quad |x(t) - y(t)| \geq l, \text{ for all } t \in [t'_0, t_f]; \\ & \quad x(t'_0) = x_{i,k}(t'_0); \quad \dot{x}(t'_0) = \dot{x}_{i,k}(t'_0); \\ & \quad x(t'_f) = 0; \quad \dot{x}(t'_f) = v_m, \end{split}$$

(After Miculescu and Karaman, 2016)

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- a vehicle is at the right time at the right place and at the right speed;
- the amount of acceleration is minimized;
- no collisions occur.



This results in the following control:

$$a(t) = x''(t) = egin{cases} -a_m & ext{if } t_0 \leq t < t_1, \ 0 & ext{if } t_1 \leq t < t_2, \ a_m & ext{if } t_2 \leq t < t_3, \ 0 & ext{if } t_3 \leq t < t_f, \end{cases}$$

for certain known and computable t_1 , t_2 and t_3 and fixed t_f .



Speed regulation and a link to queueing



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Speed regulation and a link to queueing



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Example with two streams of vehicles



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We derive approximations for the mean delay. We use the following interpolation formula (Boon et al, 2011).

$$\mathbb{E}[D_i] = \frac{K_{0,i} + K_{i,1}\rho_i + K_{2,i}\rho_i^2}{1 - \rho_i},$$

where ρ_i is the load on the intersection and with carefully chosen constants $K_{0,i}$, $K_{1,i}$ and $K_{2,i}$.

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Simulations – fairness

Fairness is an important property as well.



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We define fairness as:

$$\mathcal{F} = rac{\mathbb{E}[Y]}{\mathbb{E}[X]},$$

where *X* is the number of cars seen by an arbitrary arriving vehicle and *Y* is the number of cars from those *X* that leave the system before that arbitrary car does (Shapira and Levy, 2016)



Simulations – fairness





To represent the current traffic situation with conventional cars, we perform a simulation in SUMO



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- The exhaustive PFA is performing very close to optimality with respect to mean delay.
- There is a lot to be gained, using platoon forming and speed regulation.
- We have been looking at an *isolated* intersection. What about networks?



Thank you for your attention!

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