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COLLISION AVOIDANCE VIA ADAPTIVE TRAJECTORY CONTROL IN CASE OF A SUDDEN DECREASE IN THE MAXIMUM ROAD FRICTION COEFFICIENT

ABSTRACT

This study analyses an Adaptive Trajectory Control (ATC) system in case of a sudden change in μ_{max} (maximum tyre-road friction coefficient) during an emergency lane change manoeuvre in order to maintain the driving safety. Autonomous front wheel steering (FWS) systems have been developed for emergency steering situations. The trajectory design is also a part of these systems. Moreover, in this study ATC has been designed by sensing μ_{max} to complete the emergency steering manoeuvre successfully. Therefore, the originality of this paper arises from the necessity of a trajectory change in case of a sudden change in μ_{max} to minimize the distance between the desired and the actual path. Suitable cases were designed by using a two-track model in IPG/CarMaker (MATLAB/Simulink). Results show that ATC could be used during an emergency steering manoeuvre in case of a sudden decrease in μ_{max} as it can be advantageous in certain critical traffic situations. Therefore, ATC could be used as an alternative system instead of Electronic Stability Program.

KEY WORDS

Adaptive Trajectory Control; active safety; advanced driver assistance systems; collision avoidance; intelligent transportation systems; autonomous vehicle systems;

1. INTRODUCTION

For a long time active safety systems have been introduced to avoid collision via braking such as braking assist and corresponding stability control systems [1]. It is predicted that responses to expected events are faster than responses to unexpected events [2, 3]. Therefore, active safety systems have a significant role for avoiding possible collision with an autonomous braking system [4, 5]. Most of the active safety systems try to control longitudinal dynamics of the vehicle such as advanced emergency braking system, although in some cases active longitudinal control was not sufficient to avoid a possible collision [6]. For example, if the speed of host vehicle is more than 70-80 km/h on the dry asphalt, the distance required to avoid collision with an obstacle via a steering manoeuvre is always less than the distance required to avoid collision with

an obstacle via a braking manoeuvre [7]. Furthermore, a braking manoeuvre without steering was recognized as the most frequent first natural response of the drivers. Also, a steering manoeuvre could be observed if only a braking manoeuvre was detected as insufficient by the drivers [8-11]. Although a single steering manoeuvre could avoid a possible collision, it could be the second choice because of the lack of experience of the drivers for applying high lateral accelerations [9, 12]. Therefore, one of the most important decision error occurs, which also depends on a delayed recognition by the drivers [13-15]. This error could be solved by an autonomous steering system. On the other hand, an autonomous steering system has not been put into practice as it is still in research & development phase [15]. Many control strategies of an autonomous steering system have been developed over a long time such as MacAdam's model in [16], Sharp's model in [17], Salvucci's model in [18], Gordon's model in [19], and Ryu's model in [20]. Most of the control strategies use front wheels as instruments to follow the desired trajectory by comparing the yaw, yaw rate, lateral position and head angle of the vehicle [16-21]. By the way, μ_{max} is an important factor in the design of these trajectories. For example, a sudden change in μ_{max} may lead to a collision if the trajectory is not controlled properly. In the construction of ATC, the estimation of μ_{max} is very significant. If μ_{max} is estimated continuously during an emergency steering manoeuvre, the corresponding trajectory could be designed online. In order to estimate μ_{max} , many parameters should be observed such as side slip angle, normal and lateral forces acting on tyre, velocity of the vehicle, etc. [22-28]. Velocity of the vehicle could be observed from speedometer, rear wheel angle sensors or GPS. If the default vehicle mass is known, normal forces acting on tyres could be estimated by considering the load transfer during cornering. By the assists of GPS receiver and the gyroscopes, the longitudinal & lateral acceleration of the vehicle and yaw rate could be measured and therefore the side slip angles could be calculated. After side slip angles are calculated, the lateral forces acting on tyres could be calculated by mapping the change of

cornering stiffness of tyres from a look-up table during load transfer. Therefore, the estimation of μ could be done via measuring lateral and normal forces acting on tyres. As a result of this estimation, the vehicle stability could be maintained via ATC during an emergency steering manoeuvre.

2. METHODOLOGY

Before examining ATC, the differences between emergency steering and braking manoeuvres for the autonomous FWS system will be explained briefly. After that, the decision-making for the activation of ATC will be mentioned. For the usage of this controller, a vehicle model is necessary. The trial vehicle model, which is a bicycle model, will be explained in detail. After that, the validation model, which is a two-track vehicle model, will be mentioned briefly. Finally, the control strategy of ATC will be examined at the end of the Method.

2.1 Emergency steering vs. emergency braking

As it was mentioned in Introduction, a single braking manoeuvre was recognized as first natural response of the drivers [8-11]. The autonomous FWS system is activated via the steering wheel if only the last point to brake is missed, which is in line with the natural response of the drivers. As illustrated in Figure 1, for avoiding a collision at 100 km/h the last point to brake was calculated at 45 metres and the last point to steer via autonomous FWS system was calculated at 22-metre distance to obstacle on dry asphalt ($\mu_{max}=1$). Therefore, the autonomous FWS system was not activated before passing the last point to brake, as the collision could not be avoided without a steering manoeuvre after that.

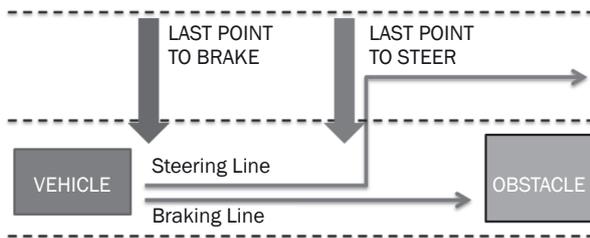


Figure 1 – Last points for emergency steering & braking to avoid collision at 100 km/h ($\mu_{max}=1$)

As shown in Equation 1, d_{brake} stands for the minimum longitudinal distance from the obstacle to avoid collision (last point to brake) via braking [29]. It depends on the average longitudinal deceleration $a_{x(mean)}$, speed of the vehicle $v_{vehicle}$ and reaction time $\tau_{reaction}$. The average longitudinal deceleration was calculated according to the full braking exercise done

in IPG/CarMaker software on dry asphalt. The reaction time was defined as 160 ms assuming that the vehicle was equipped with a collision warning system such as forward collision warning. This is in line with the studies as the mean reaction time for sound stimulus is 160 ms [30, 31]. In this study, the vehicle was not equipped with an autonomous braking system and therefore human reaction time was taken into consideration to calculate the last point to brake.

$$d_{brake} = \frac{1}{2 \cdot a_{x(mean)}} v_{vehicle}^2 + \tau_{reaction} v_{vehicle} \quad (1)$$

As shown in Equation 2, d_{steer} stands for the minimum longitudinal distance from the obstacle to avoid collision (last point to steer) via steering [29]. It depends on the maximum lateral acceleration $a_{y(max)}$, speed of the vehicle $v_{vehicle}$ and width of the steering manoeuvre, y_{end} . The reaction time was not taken into consideration as the steering manoeuvre was not performed by a human driver. The steering manoeuvre was done via autonomous FWS system and therefore, the reaction time was ignored here.

$$d_{steer} = \sqrt{\frac{2 \cdot y_{end}}{\mu_{max} \cdot a_{y(max)}}} v_{vehicle} \quad (2)$$

2.2 Decision making

The proposed adaptive trajectory will be analysed in this study. The trajectories for the dry ($\mu_{max}=1$) and wet asphalt ($\mu_{max}=0.5$) will be compared with the adaptive trajectory on the changeable μ_{max} . As illustrated in Figure 2, the autonomous FWS system with the trajectories for the dry and wet asphalt cannot avoid collision individually on the changeable μ_{max} . On the other hand, the autonomous FWS system with the adaptive trajectory could avoid a possible collision.

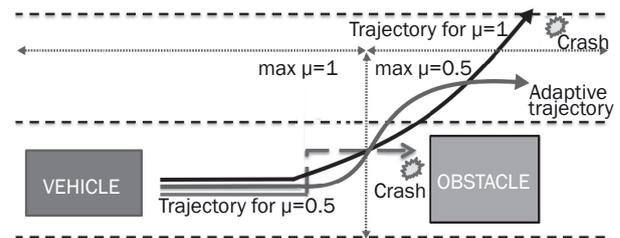


Figure 2 – Adaptive trajectory in case of a sudden decrease in μ_{max}

There are some limitations in the activation of ATC such as Electronic Stability Program (ESP). The flowchart for the activation of ATC could be seen as illustrated in Figure 3. The first condition for the activation of ATC is missing the last point to brake. The target lane should be free also for an emergency lane change manoeuvre to avoid an unexpected collision with another obstacle or vehicle. In order to fulfil this

condition, the blind spot detection system or corresponding systems could be used [32]. If the autonomous FWS system begins an emergency lane change with the default calculated trajectory, the system also checks whether μ_{max} is changeable. If μ_{max} is stable, ATC is not activated. On the other hand, if μ_{max} is changed according to μ estimation, ESP should be observed. If ESP is activated because of the stability loss, ATC will not be activated either. For example, ATC is designed to switch smoothly into the trajectory for the wet asphalt from the trajectory for the dry asphalt. If ESP is active, the vehicle may step out from its actual trajectory and therefore smooth transition into the trajectory for the wet asphalt could be impossible. For this reason, ATC is activated only if ESP is not active. ESP stabilizes the vehicle by performing a single braking on a decided wheel from the observed yaw rate, vehicle velocity and steering angle. On the other hand, ATC system stabilizes the vehicle by changing the trajectory from the observed friction, vehicle velocity and calculated trajectories.

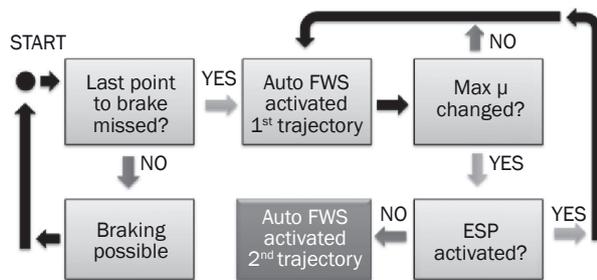


Figure 3 – Decision-making for ATC

2.3 Vehicle stability criteria via the trial vehicle model (bicycle model)

The stability of the proposed bicycle model could be identified by observing the tyre side slip angles α_i and α_r , under steer coefficient of vehicle K_{us} , corresponding characteristic speed of the vehicle V_{ch} and μ_{max} . The under-steer coefficient of vehicle K_{us} and the corresponding characteristic speed of vehicle V_{ch} could be calculated as shown in Equations 3 and 4 [33, 34]. W_i and W_r are the weight of the front and rear axle, respectively, and g is the gravitational acceleration in Equations 4 and 5. Furthermore, the relationship between the friction coefficient of the road μ , cornering (lateral) force acting on tyre F_y and normal force acting on tyre F_z could be seen in Equation 5 [35].

$$K_{us} = \frac{W_i}{C_i} - \frac{W_r}{C_r} \tag{3}$$

$$V_{ch} = \sqrt{\frac{gL}{K_{us}}} \tag{4}$$

$$\mu = \frac{F_y}{F_z} \tag{5}$$

The characteristic speed of the vehicle can only exist if the understeer coefficient of the vehicle is above zero [34]. Directional stability of the vehicle depends on the under-steer coefficient of the vehicle. If the value of K_{us} is designed to be above zero, the vehicle is always directionally stable [34]. By obtaining directional stability the vehicle could be returned back to a straight line path via a sufficient steering manoeuvre [34]. Moreover, of μ_{max} is also another factor to identify the stability limits of the vehicle. For a dry asphalt μ_{max} is 1.0- 1.2 [35]. It could be assumed that the vehicle is in the stable region by staying in the linear region of μ curve [34]. According to the real tyre data, the linear region of μ curve could be valid until 50% of μ_{max} [34-35]. On the other hand, the maximum value of the corresponding linear region of μ curve is assumed as 83% of μ_{max} , such as 1.0 in this study. Therefore, in this vehicle model beyond 83% of μ_{max} the vehicle is assumed to be unstable.

The vehicle parameters could be seen as illustrated in Table 1. The under-steer coefficient of the vehicle is above zero; therefore, the vehicle is always directionally stable [34]. As the maximum value of the corresponding linear region of μ curve is assumed as 83% of μ_{max} , the maximum allowable absolute side slip angle of front and rear tyre is 4.3 and 3.8, respectively, to maintain the vehicle stability [34]. The steering ratio from the front tyre to the steering wheel is 1/15 as shown in Table 1.

Table 1 – The vehicle parameters that have an impact on the vehicle stability

Vehicle mass	1,000	kg
Yaw inertia	1,650	kgm ²
Max friction coefficient of road	1.2	-
Max linear region of μ curve	1.0	-
Distance from cog to front axle	1	m
Distance from cog to rear axle	1.5	m
Cornering stiffness of front tyre	1,395	N/deg
Cornering stiffness of rear tyre	1,046	N/deg
Under-steer coefficient	+0.515	deg
Characteristic speed	187	km/h
Steering ratio from front tyre to steering wheel	1/15	-
Max/min allowable side slip angle of front tyre for stability	+/-4.3	deg
Max/min allowable side slip angle of rear tyre for stability	+/-3.8	deg

2.4 Adaptation to two-track model (CarMaker Model)

All vehicle parameters (except the cornering stiffness of tyres) explained in the bicycle model have been reserved in the two-track vehicle model. Additionally, the tyre model is included in the two-track CarMaker model. Tyre parameters are shown in Table 2.

Table 2 – Tyre parameters in two-track (CarMaker) model

Tyre model	RT 225 60 R15	-
Longitudinal force (standstill)	0.02	-
Lateral force (standstill)	0.2	-
Velocity limit (standstill)	0.25	m/s
Longitudinal force (relaxation length)	0.05	m
Lateral force (relaxation length)	0.1	m
Aligning torque (relaxation length)	0.05	m
Friction coefficient of road	1.0 and 0.5	-
Kinematic tyre radius	0.3084	m
Nominal tyre radius	0.3284	m

In addition to tyre parameters, the height of the centre of gravity, which was not used in the bicycle model, was designed at 0.5 metres. The tyre model coming from the magic equations (Pajacka tyre model) is embedded by default in the CarMaker software. Therefore, the stability proof is valuable according to this validation.

2.5 Control strategy

As the vehicle models and the corresponding stability criteria were explained in the previous sections, the control strategy can be described. As shown in Figure 4, the whole control model of the system can be seen. There are three types of controllers in this system. The automatic FWS yaw controller and the feedback yaw rate controller are both proportional-integral (PI) controllers that were designed with the same criteria. The steering behaviour of the driver models are not

included in the system as the driver is not necessary in a full autonomous vehicle [36]. The automatic FWS system generates the reference steering trajectory depending on μ_{max} , vehicle speed and the distance to obstacle.

In order to define suitable trajectories for the autonomous FWS system, μ_{max} should be measured first.

2.5.1 The μ estimation

To estimate μ , F_y and F_z should be calculated continuously.

$$\Delta F_{z(right)} = F_{z(front\ right)} + F_{z(rear\ right)} - F_{z(front\ left)} - F_{z(rear\ left)}$$

$$= -2\left(\frac{k_f}{e_f} + \frac{k_r}{e_r}\right)\vartheta - 2m\frac{a_y}{L}\left(\frac{h_f \cdot b}{e_f} + \frac{h_r \cdot a}{e_r}\right) \quad (6)$$

$$F_{y(front)} = C_i \cdot \alpha_i \quad (7)$$

$$F_{y(rear)} = C_r \cdot \alpha_r \quad (8)$$

In order to calculate F_z for all wheels, the load transfer should be taken into consideration. For example, if the steering wheel is steered counter clockwise, the normal load on the right wheels will increase. The increase could be seen in Equation 6, where ϑ is the vehicle body roll angle, k_f and k_r are the front and rear roll stiffnesses, e_f and e_r are the front and rear vehicle's track, h_f and h_r are the front and rear height of roll centres, respectively [27]. In order to calculate F_y for all wheels, the corresponding cornering stiffnesses and side slip angles of the tyres are necessary as shown in Equations 7 and 8 [33]. On the other hand, actual F_y and F_z could be observed directly as individual signals in IPG/CarMaker software. By calculating or observing F_y and F_z , actual μ can be calculated. In order to estimate μ_{max} , the behaviour of actual μ should be observed. If μ starts fluctuating suddenly, it means that at that point $\mu = \mu_{max}$.

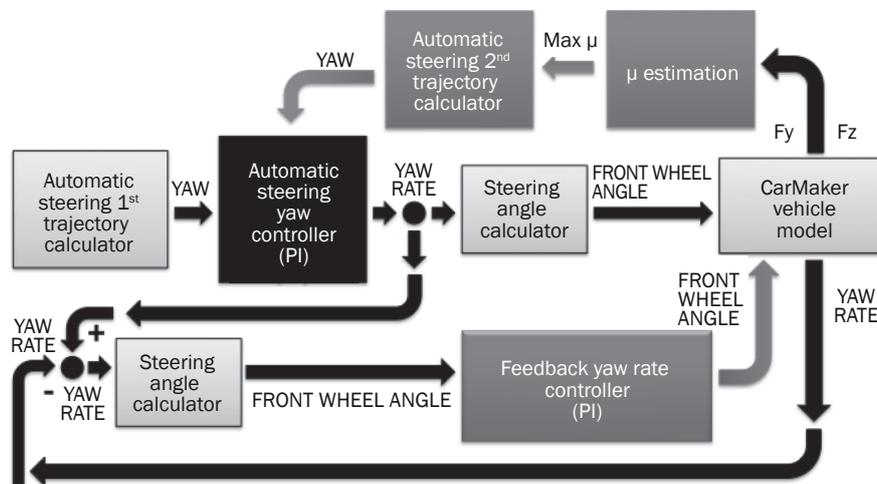


Figure 4 – The control strategy of ATC

2.5.2 Trajectory design

After deciding μ_{max} , the trajectory of an emergency steering manoeuvre could be calculated as shown in Equation 9 [25, 37]. The width of the manoeuvre is y_{end} , the longitudinal length of the manoeuvre is x_{end} and the actual position of CoG in the longitudinal axis is x as shown in Equation 9. The coordinates in Y and X axes of any selected point on this trajectory are y_{des} and respectively x as shown in Equation 9.

$$y_{des}(x) = y_{end} \left[10 \left(\frac{x}{x_{end}} \right)^3 - 15 \left(\frac{x}{x_{end}} \right)^4 + 6 \left(\frac{x}{x_{end}} \right)^5 \right] \quad (9)$$

The y_{end} was selected at 3.0 metres for an emergency lane change manoeuvre. The selection of y_{end} directly depends on the lane width; however, the selection of x_{end} does not depend on a single parameter because the vehicle stability should be maintained while avoiding a possible collision. As mentioned before, d_{steer} in Equation 2 stands for the minimum longitudinal distance from the obstacle to avoid collision (last point to steer) via steering [29].

$$x_{end} = \sqrt{\frac{2y_{end}}{\mu_{max} \cdot a_{y(max)}}} v_{vehicle} \quad (10)$$

The x_{end} is calculated as shown in Equation 10. In this equation, μ_{max} directly affects the maximum lateral acceleration of the vehicle and the tyre sideslip angles, and $v_{vehicle}$ shows the speed of the vehicle that was defined as 100 km/h in the whole study.

As mentioned before, ATC was designed to switch smoothly into the trajectory for the wet asphalt from the trajectory for the dry asphalt. The corresponding trajectories for ATC could be calculated from Equations 9 and 10 depending on μ_{max} . The only parameter which is different in both trajectories is μ_{max} . The switching point of the trajectories is the intersection point of the steering wheel angles of the trajectories. The first part of the steering manoeuvre avoids collision to obstacle and the second part stabilizes the vehicle during the lane change. The switching point appears in the second part. These points will be mentioned in detail in the discussion part after presenting the results.

$$\omega = \tan^{-1} \left(\frac{\dot{y}_{des}}{\dot{x}} \right) \quad (11)$$

From now on the trajectory could be calculated as a vehicle position in both X and Y-axes. On the other

hand, the yaw controller needs an input (yaw) to produce an output (yaw rate) as shown in Figure 4. Therefore, the calculated trajectory should be transferred to the corresponding yaw from the vehicle position. The corresponding yaw ω could be calculated as illustrated in Equation 11 [38]. The \dot{y}_{des} and \dot{x} are the derivatives of y_{des} and x , respectively, regarding time.

2.5.3 Controller design

After calculating the corresponding yaw from the designed trajectory, the yaw controller could be designed with a low pass filter to provide smooth values of yaw rate. As illustrated in Figure 5, the closed loop control model of the yaw controller could be seen. The plant was designed to be a low pass filter between the yaw rate values where τ is the lag time [38]. τ is defined as 0.1 seconds in this study. In order to maintain the yaw control with this plant, two types of controllers were proposed such as proportional-integral (PI) and proportional-derivative (PD) control [38, 39].

The root locus form of the closed-loop control system with PI and PD controllers could be seen in Equations 12 and 13, respectively [39].

$$1 + K \left(\frac{8s + 1}{0.1s^3 + s^2} \right) = 0 \quad (12)$$

$$1 + K \left(\frac{0.125s + 1}{0.1s^2 + s} \right) = 0 \quad (13)$$

Parameter K in Equations 12 and 13 affects the damping ratio, maximum overshoot and rise time of the controllers [39].

The parameters which have an impact on vehicle stability, could be observed by performing the exact steering manoeuvre described in Trajectory design, such as the maximum absolute yaw rate output, maximum absolute lateral acceleration, maximum absolute steering angle rate, maximum absolute lateral jerk and maximum absolute front/rear tyre side slip as shown in Table 3. Although the duration of the manoeuvre was similar with both PI and PD controllers, the results show that the PI controller indicated smoother responses than the PD controller as shown in Table 3. The usage of the derivative in the PD controller resulted in an aggressive response. Therefore, the PI controller was selected as the yaw controller of the system to follow the desired trajectory.

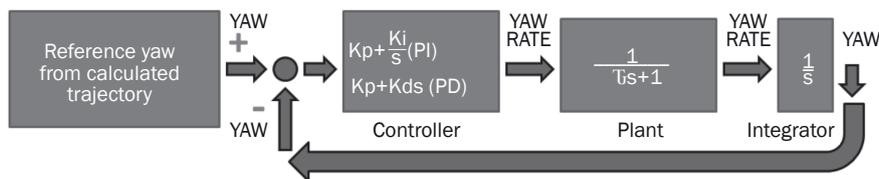


Figure 5 – Yaw controller

Table 3 – The differences between the PI & PD yaw controllers for the same steering manoeuvre

Controller type	PI	PD
Steady state error	< 1%	0%
Maximum overshoot	< 5%	0%
Rise time	0.7 s	0.7 s
Damping ratio	0.707	1.0
K in Equations 12 and 13	0.3206	4.0
Max absolute yaw rate output	18 deg/s	25 deg/s
Max absolute lateral acceleration	6.0 m/s ²	7.5 m/s ²
Max absolute steering angle rate	200 deg/s	>1,000 deg/s
Max absolute lateral jerk	25 m/s ³	>1,000 m/s ³
Max absolute front/rear tyre side slip	2.6/2.75 deg	3.2/3.5 deg

There are examples of the controllers in literature such that MacAdam's & Sharp's model uses the predicted and desired lateral position in [16, 17], Salvucci's model uses the heading angle from the desired points of the lateral position in [18] and Gordon's model uses the yaw rate in [19] as the controller parameters [21]. In this study the desired yaw is calculated from the desired lateral position which is similar to MacAdam's and Sharp's model in [16, 17], and also the calculated yaw is converted to the desired yaw rate as the closed-loop control parameter which is similar to Gordon's model in [19].

The feedback yaw rate controller was also defined as the PI controller which uses the same plant and exact design criteria of the yaw controller. The output of the yaw controller is the yaw rate moving to the steering angle calculator as shown in Figure 4. The calculated yaw rate is the reference for the feedback yaw rate controller after passing the steering angle calculator as shown in Figure 4. Moreover, the yaw rate value should be converted to the front wheel angle for the input of the yaw rate controller. This conversion can be done from the yaw rate $\dot{\omega}$ to the front wheel angle δ_i as shown in Equation 14 [38]. By the way, the corresponding steering wheel angle could be calculated from the front wheel angle by considering the steering ratio mentioned in Table 1.

$$\delta_i = \frac{\dot{\omega}L}{u} \left(\frac{u^2}{v_{ch}^2} + 1 \right) \tag{14}$$

3. RESULTS

The simulations were done via the validation of IPG/CARMAKER software at 100 km/h constant vehicle speed without a braking manoeuvre. Two types of μ_{max} were used in this simulation such as 0.5 for the wet asphalt, 1.0 for the dry asphalt and both 0.5 & 1.0 for the changeable asphalt. For the dry asphalt, the last

point to brake was calculated as 45 metres and for the wet asphalt, the last point to brake was calculated as 80 metres. Moreover, there are three cases in this simulation as shown in Table 4. In the first case, the steering manoeuvre for the dry asphalt was performed (1st trajectory/black curve) without ATC. In the second case, the steering manoeuvre for the wet asphalt (2nd trajectory/red curve) was also performed without ATC. In the third case, the steering manoeuvre was performed with ATC (includes both 1st & 2nd trajectories/blue curve). The colour of all cases was also shown in Table 4 for the figures representing lateral acceleration, yaw rate, roll angle and lateral vehicle position and steering wheel angle.

Table 4 – Three cases representing the colour of cases, status of ATC and trajectory type

Cases	Trajectory Type	ATC
1 (black)	only for dry asphalt ($\mu_{max}=1$)	OFF
2 (red)	only for wet asphalt ($\mu_{max}=0.5$)	OFF
3 (blue)	for changeable conditions	ON

3.1 Comparison of 1st and 2nd case on the corresponding μ_{max} , 1.0 and 0.5, respectively

Before performing the simulation on the changeable road, it was performed on full dry asphalt and full wet asphalt to observe the differences of both trajectories on their own μ_{max} . Vehicle lateral acceleration, yaw rate, roll angle and lateral position of both cases were shown in Figures 6a, 6b, 6c and 6d, respectively during the emergency lane change. In the first case (black), the distance to obstacle for the beginning of the steering manoeuvre was defined as 30 metres on the full dry asphalt (1st trajectory). In the second case (red), the distance to obstacle for the beginning of the steering manoeuvre was defined as 36 metres on the full wet asphalt (2nd trajectory). As mentioned before, the only parameter which is different in both trajectories is μ_{max} . In both trajectories, the emergency steering manoeuvre was performed successfully without resulting in a collision or loss of vehicle stability.

3.2 Comparison of the three cases on the changeable μ_{max}

For this time, during 0-277 metres of road μ_{max} equals 1.0, and after the 277th metre of road μ_{max} equals 0.5. In the first case (black), the distance to obstacle for the beginning of the steering manoeuvre was defined at 30 metres on the changeable asphalt (1st trajectory). In the second case (red), the distance to obstacle for the beginning of the steering manoeuvre was defined at 36 metres on the changeable asphalt (2nd trajectory). In the third case, the

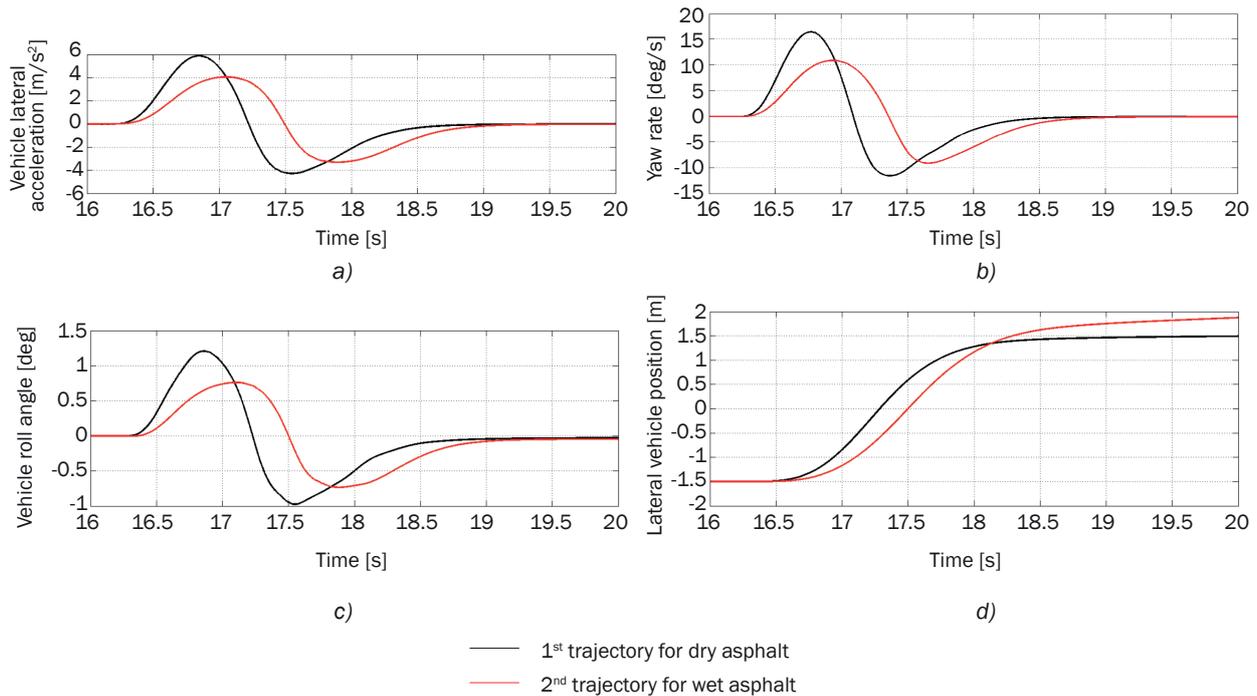


Figure 6 – a) Vehicle lateral acceleration for 1st and 2nd case; b) Vehicle yaw rate for 1st and 2nd case; c) Vehicle roll angle for 1st and 2nd case; d) Vehicle lateral position for 1st and 2nd case

distance to obstacle for the beginning of the steering manoeuvre was defined at 30 metres on the changeable asphalt (ATC using both 1st and 2nd trajectory). The μ_{max} changed from 1.0 to 0.5 in the 16.7th second of the simulation for all cases. ATC followed the 1st trajectory until the 17.4th second of the simulation. It started to follow the 2nd trajectory after that.

As shown in Figure 7a, the collision to obstacle was avoided via the 1st trajectory and ATC. On the other hand, the collision was not avoided via the 2nd trajectory. Moreover, as illustrated in Figure 7b, the collision depending on the stability of the vehicle was avoided via the 2nd trajectory and ATC, but not via the 1st trajectory. Therefore, the only case in which all possible collisions were avoided is performed via ATC.

As shown in Figures 8a and 8b, lateral acceleration and yaw rate fluctuated when μ_{max} changed suddenly in the 16.7th second. As illustrated in Figure 8c, ATC

followed the 1st trajectory until the 17.4th second and after that switched into the 2nd trajectory. It came to the desired point approximately in the 19th second. Moreover, ATC (blue) followed the same steering angle inputs as the 1st trajectory (blue-black) until the 17.4th second (yellow star) as shown in Figure 8d. On the other hand, ATC switched into the 2nd trajectory (red) after the 17.4th second (yellow star) which is the 2nd intersection point of the steering wheel angles of the 1st and 2nd trajectory. Therefore, ATC seems blue until the 17.4th second (yellow star) and it seems red after that.

The trajectories followed by ATC and the road conditions are illustrated in Figure 9, such as the beginning of the emergency steering manoeuvre, the change point of μ_{max} , the trajectory switch point and the obstacle avoidance point, respectively. Not only the obstacle was avoided, but also the vehicle lateral stability was maintained via ATC.

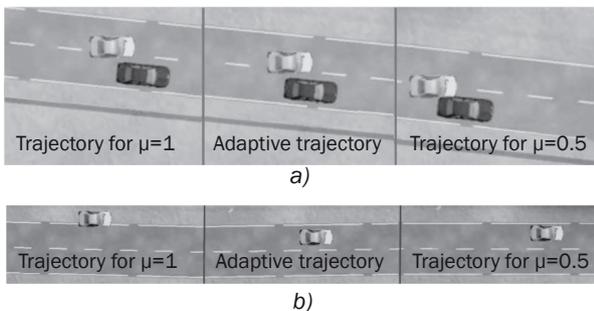


Figure 7 – Positions of the vehicle: a) at the beginning of the emergency steering manoeuvre; b) at the end of the emergency steering manoeuvre

3.3 The μ_{max} detection according to μ estimation

As shown in Figure 10, the black curve represents μ estimation of the 1st trajectory on the full dry asphalt. There is no sharp fluctuation in the black curve which represents an unchanged road condition. The blue curve represents μ estimation of ATC on the changeable asphalt. It could be observed that the blue curve fluctuates sharply in the 16.7th second of the simulation. This is the point of μ_{max} detection. After this point, it could be observed that μ_{max} equals 0.5 instead of 1.0.

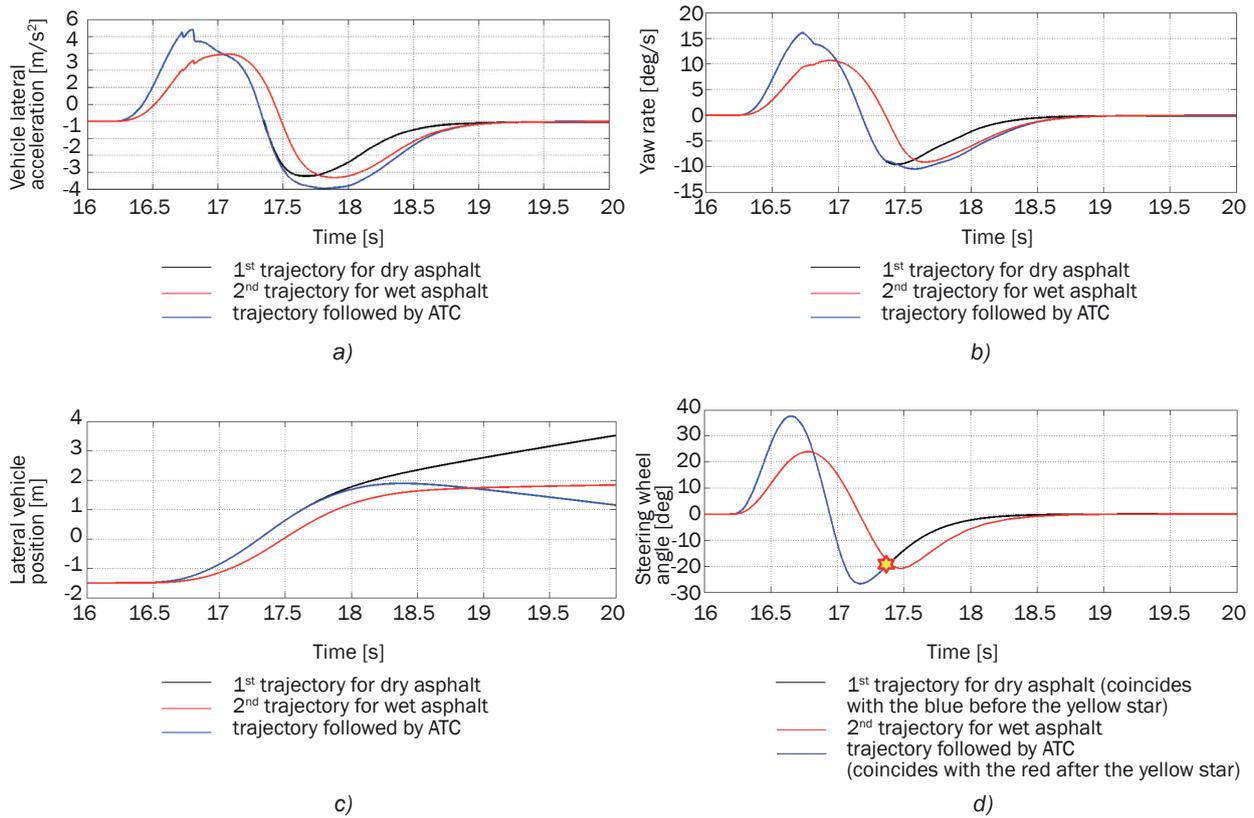


Figure 8 – a) Vehicle lateral acceleration in all case; b) Vehicle yaw rate in all cases; c) Vehicle lateral position in all cases; d) Steering wheel angle in all cases

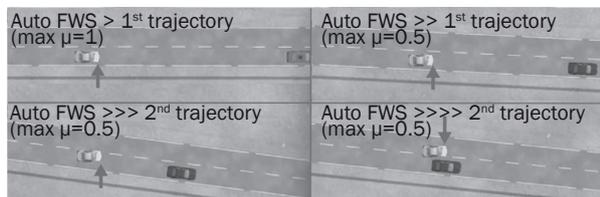


Figure 9 – Trajectory switching points in ATC

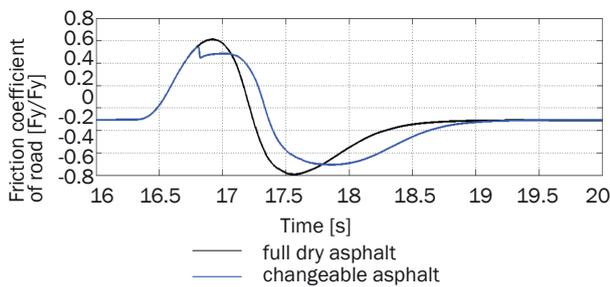


Figure 10 – μ estimation

4. DISCUSSION

This study depends on the perfection of the detection of μ_{max} . It could be possible to detect it by measuring or calculating F_y and F_z , by using Kalman Filter, by pseudostatic lugre friction model, by dynamic lugre model or by a slip calculation in traction and braking

[22-28]. There are many ways to detect the change in μ_{max} . In this study, μ_{max} was detected by observing μ estimation. An unexpected change or fluctuation in μ represents the point where $\mu = \mu_{max}$.

The most important part after the detection of μ_{max} is the specification of the trajectory switch point of ATC. ATC followed the 1st trajectory until the 2nd intersection points of the steering wheel angles of the trajectories as shown with a yellow star Figure 8d. The first part of the emergency steering manoeuvre is to avoid collision to obstacle. The second part exists to stabilize the vehicle in order to complete the lane change manoeuvre. Therefore, the ATC switches the trajectory in the second part to stabilize the vehicle.

As also mentioned in the decision-making, ESP should not be active during the first part of the emergency steering manoeuvre in order to perform a smoother trajectory switch via ATC. Although ESP was not active, via the 1st trajectory (for $\mu_{max}=1$) the vehicle could not maintain the stability without ATC. Therefore, ATC is necessary for this kind of situations. On the other hand, if ESP is active because of a stability loss, the trajectory switch could be cancelled via ATC because a loss of the intersection points of the trajectories is possible. And also, if ESP is active, the second part of the emergency steering manoeuvre (stability) can be performed by ESP itself automatically instead of ATC.

5. CONCLUSION

In this study, an Adaptive Trajectory Control (ATC) system was analysed during an emergency lane change manoeuvre. It was observed that ATC can avoid a possible collision while maintaining the vehicle stability. The yaw and yaw rate feedback controller assisted the vehicle to follow the desired trajectory. On the other hand, they are not able to switch into a new trajectory. The advantage of ATC is switching into a suitable trajectory depending on μ_{max} . Moreover, the simulations were done via the validation of the two-track vehicle model (CarMaker vehicle model) that considers the load transfer during high lateral accelerations. Therefore, ATC was analysed successfully according to vehicle stability criteria. Moreover, the manoeuvres and the change in μ_{max} were designed by assuming ESP is inactive. If ESP is active, ATC should be cancelled because of the possibility of discrete transition between trajectories. As a future study, ESP and ATC may be controlled together via intelligent decision-making.

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ADAPTIF YÖRÜNGE KONTROL SİSTEMİYLE DEĞİŞKEN ZEMİN KOŞULLARINDA OLASI BİR KAZANIN ENGELLENMESİ

ÖZET

Bu çalışmada, ani zemin değişiminde yapılan direksiyon manevrasının kazayla sonuçlanmaması için adaptif yörünge kontrol sistemi (AYK) geliştirilerek IPG/CarMaker (MATLAB/Simulink) programı üzerinde yapılan simülasyonlarla test edilmiştir. Literatürde otomatik direksiyon manevrası yapan sistemler mevcuttur. Yörünge tasarımı da bu sistemlere dahildir. Ancak, bu çalışmada zemin sürtünme kuvveti katsayısı hesaplanarak zemin şartlarına göre gerekli yörünge değişimi anlık olarak yapılmaktadır. Bu çalışmanın özgünlüğü direksiyon manevrası esnasında zemin koşullarında ani bir değişim olması durumunda anlık yörünge değişiminin yapılmasıdır. Yapılan simülasyonlar sonucu AYK sistemi Elektronik Stabilitate Kontrolü'ne alternatif olarak gösterilebilir.

ANAHTAR KELİMELER

adaptif yörünge kontrol sistemi; aktif güvenlik; sürücü destek sistemleri; kaza önleme sistemleri; akıllı taşıt sistemleri; otom araçlar;

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