# Design of an active device for controlling lateral stability of fast mobile robot

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#### **SUMMARY**

Motivated by the trade-off between speed and stability for off-road navigation, a novel active anti-roll system has been developed in the context of a multidisciplinary project which aims at developing a high-speed and agile autonomous off-road rover. This paper presents the design, simulation and experimental validation of an active anti-roll system and its associated control. The proposed system possess the advantage of having a modular design that can be installed on any off-road chassis with independent suspensions. The proposed system controls directly the roll angle of the rover which is usually uncontrollable in conventional vehicles, hence improving off-road stability while maneuverings at high speed over uneven terrain. Furthermore, the control of the proposed active anti-roll system is based on a model predictive control (MPC) for the roll dynamics, which minimizes the load transfer during cornering and the energy consumed by the actuators. The control model is based on a dynamic model of the rover and on a stability criteria defined by the lateral load transfer (LLT). Moreover, this paper presents, simulation results from the high fidelity virtual platform modeled in *MSC.Adams*<sup>®</sup>, as well as, results from recent field tests demonstrating the effectiveness of a hydraulic active anti-roll system mounted on, an especially developed experimental platform, SPIDO ROBOT while cornering at a high speed reaching 8 m/s.

KEYWORDS: Active anti-Roll system; Roll dynamics; Vehicle stability; Lateral load transfer stability criterion.

## 1. Introduction

Outdoor mobile robots have to perform operations at increasingly greater distances and speeds.<sup>1,2</sup> Therefore, we are interested in the design and control of fast rovers which are able to move autonomously in a natural environment, following, at high velocity (up to 10 m/s), a virtual corridor referred to by GPS points. Generally, off-road rovers have an elevated center of gravity for rock collision avoidance, and have an important suspension displacement for obstacle crossing.<sup>3</sup> These two features, combined with a high speed, could cause tip-over situations, generally in the lateral direction. Moreover, current perception systems are not sufficiently accurate or rapid to perform safe autonomous land traversing. Indeed, the robot could undergo critical disturbances due to collisions with obstacles or contact failures when crossing holes. These disturbances can create instabilities, or even rover tip-over. Hence, it is worth developing active mechanical systems which make system state correction possible when the rover approaches these hazardous situations.<sup>6–8</sup> In this context, our work introduces a new solution based on the use of an active anti-roll mechanism combined with an MPC, which can avoid these situations and increase the stability margin of the vehicle, thus improving the mobility and crossing performance of the robot.

Stability control is a central issue for developing safe navigation on natural terrain. Nowadays, it is done by introducing into the trajectory generator appropriate constraints characterizing the tip-over

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conditions. Ref. [9] considers a stability domain defined in the 2D-space velocity-path curvature and applied to a rigid robot model. Ref. [10] considers a complex car model including a tire relationship to define a combined with an MPC which optimizes, over a receding horizon, a quadratic criterion composed of the trajectory parameters and the control expression. This method, and in a similar manner, 11,12 utilize wheel torques and/or steering angles as control inputs. A well-known example from the field autonomous off-road vehicles is Stanley. Stanford's autonomous vehicle that won the DARPA Grand Challenge race and crossed more than 200 Km in the Mojave desert in almost 7 h. The vehicle's controller bounded the lateral acceleration to 0.75 m/s² to avoid tip-over conditions. This stability control approach, limiting system velocity and/or steering angle, can lead to a conservative system, thus reducing system performance. The second approach to vehicle stabilization consists of integrating a dedicated mechanical device. In this paper, we will focus mainly on stabilization in the roll direction and on the minimization of the lateral tip-over risk.

Anti-roll systems have been widely studied and developed in the automotive and railway industries. The main motivation is to increase handling characteristics and decrease rollover accidents. Before the advent of embedded and low cost measurement systems, passive anti-roll bar (or sway bar or stabilizer bar) was the standard technology in most of the vehicles. <sup>14</sup> The passive anti-roll bar is usually in the form of a torsional bar connecting opposite (left/right) wheels together. It generally helps in resisting vehicle body roll motions during fast cornering by increasing the vehicle's roll stiffness. However, the major drawback for the passive linkage is that it introduces a coupling between the suspensions which undesirably transfer the perturbations (bumps, holes, gravel shoulders) from one side to the other. This is called the "copy" effect. In addition, the fixed stiffness of the passive anti-roll bar and its ratio between the front and back axles dictate a certain behavior that cannot adapt to the high irregularity of the off-road conditions. Thus, the design of the passive anti-roll bar is subject to conflicting aims.

Historically, the idea of powered tilt can be dated back to the late 60s when the British Railways desired to increase the average speed of its fleet in a cost effective way. <sup>15</sup> Therefore, in order to avoid the exorbitant cost of building a new infrastructure that does not exceed the permissible lateral acceleration; the more plausible solution was to modify the train vehicle by providing a mechanical mechanism (air-springs, anti-roll bars, swing bolster, etc.) that compensate for the lateral acceleration by tilting the car body inwards the curve. Nowadays, active tilting is the standard technology for high-speed trains.

In the automotive industry, numerous solutions have already been proposed to equip vehicles with mechatronic solutions including active suspension systems and active stability control systems. Most of these solutions are not suitable for off-road conditions<sup>16</sup> or aim to optimize ride comfort criteria<sup>17</sup> which is of little relevance to the unmanned rover application. However, we mention some of the relevant works done that directly control the roll angle of the vehicle. Several approaches, inspired by the passive anti-roll device, use a hydraulic actuator in the place of the torsion bar. This actuator can create an opposite displacement between the left and right suspensions but it does not participate when these displacements are equal (with the same sign). Hydraulic actuation is chosen for its high-force density, robustness, inhibition faculty (bypass mode interconnecting the two chambers of each cylinder) as well as maturity of technology and commercial availability of various parts. BMW developed an active roll stabilization (BMW-ARS) system<sup>18</sup> by installing a hydraulic rotary actuator in the center of the anti-roll bar. The roll angle is suppressed by a linear feedback system using the information given by the lateral acceleration sensor. Independent active suspension uses hydraulic struts placed in parallel with the conventional shock absorbers 19,20 or in series with the spring as in Mercedes Active body control;<sup>21</sup> however, the position-based control of this actuator cannot provide compliant behavior with an adequate time response. Refs. [22] and [23] presented an investigation of an active hydraulic anti-roll bar implemented on heavy articulated vehicle controlled by Linear Quadratic Regulator (LQR controller) based method as well as optimal control strategy. It was reported that the designed system reduce the peak normalized load transfer by 20% in comparison to a passive vehicle.

An alternative approach, proposed by BOSE,<sup>24</sup> to replace the conventional passive dampers by linear electromagnetic actuators.<sup>25</sup> Although the system is able to recuperate energy by driving the linear motors in generator mode,<sup>26</sup> the high bandwidth active suspensions have high energy demands which make it not suitable for a robotic application with limited energy resources. On the other hand, low-power consumption approaches do not offer direct control of over the roll angle, which lead to degraded performance in high lateral acceleration regime. We mention the concept of passively

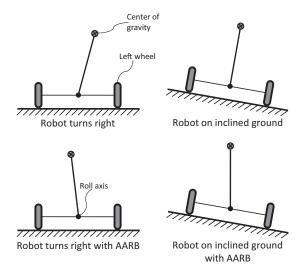


Fig. 1. Alternative kinematic configuration for the active anti-roll mechanism.

inter-connected suspensions<sup>27</sup> whose principle consists of connecting the hydraulic dampers in various ways by using distributors. The four wheel interconnected systems can provide an increased roll stiffness combined with reduced articulation stiffness and decoupled roll and bounce damping with the expense of increased weight and complexity. A semi-active system, reported in, consisting of a passive anti-roll bar with switchable additional springs, such system can regulate the roll stiffness but cannot directly control the roll angle. Ref. [28] implemented steering and direct tilt control (SDTC) on a narrow three-wheeled tilting vehicle for urban transportation. In the proposed system, the cabin can be directly tilted relative to a non-tilting rear module containing the engine and drive system. The controller uses the steer angle and speed to estimate the steady state lateral acceleration and calculates the required tilt angle accordingly. It is however stated that, this principle is more effective on narrow vehicles and cannot be easily integrated into off-road vehicles.

This paper presents the design, control and experimental results of an innovative mechatronic device which is able to control the roll stability of the rover in off-road conditions. The proposed system is controlled by an MPC in real-time, rather than just Proportional Integral Derivative controller (PID controller) or LQR-based methods. The MPC has the advantage of optimizing current action while anticipating future events and controlling the active anti-roll bar accordingly. First, we start by presenting the kinematics of the mechanical system and its velocity and force transmission. The next section presents the dynamic model of the vehicle, and especially its roll dynamics and the stability index based on the lateral load transfer. Based on the linearized form of this dynamic model, an MPC system is designed. This control assumes that the desired path and velocity are known over the receding time horizon. The control optimizes mixed criteria which combine the stability of the robot and its power consumption. Finally, we present simulation results using Matlab-Simulink/Adams co-simulation and the experimental results obtained from a SPIDO ROBOT platform.

## 2. Active Anti-Roll Mechanism

Nowadays, most on-road vehicles are equipped with passive anti-roll bars. Thanks to a flexible bar which couples the right and left suspensions, the roll angle is minimized when the vehicle corners. This system acts against any asymmetrical movements between right and left suspensions, especially when the vehicle is submitted to a lateral acceleration (due to centrifugal or gravitational forces). It is used during a steady turning motion and even on an uneven road surface (inclined ground), as shown in Fig. 1. The proposed mechanism, inspired by this passive system, replaces the torsion bar with an actuator which, by creating an opposite motion between right and left suspensions, changes the roll configuration of the rover (Fig. 2). The horizontal linear actuator, when changing its length, acts on two rocking levers which create two opposite deformations on the right and left double-wishbone suspensions.

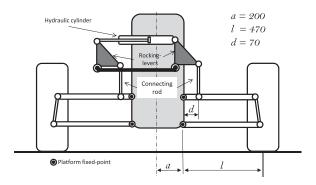


Fig. 2. Kinematics of the active anti-roll mechanism.

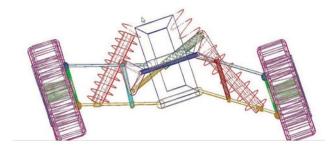


Fig. 3. Alternative kinematic configuration for the active anti-roll mechanism.

It is clear that this system creates a coupling between the suspensions and can reduce the capacity to cross unilateral discontinuities. However, hydraulic actuation can be rendered almost transparent by interconnecting the two chambers of each cylinder. Thus, by using hydraulic distributors and bypass cylinders, we can configure the anti-roll system, depending on the ground conditions and other robot parameters.

Figure 3 illustrates another quite similar kinematic configuration which could be used for the conversion mechanism. Contrary to the first configuration, it has symmetrical positions for the rocking lever fixed hinges with respect to the sagittal plane.

Based on dynamic simulations using Adams Software, the velocity and force transmissions appear to be comparable between the two solutions. However, we give preference to the first approach, mainly because of the linearity of the transmission characteristic. As can be observed in Fig. 4, which illustrates the relationship between the roll angle and the actuator displacement, for the first kinematic configuration the first solution with a horizontal linear actuator exhibits quite linear behavior in the roll interval of  $\pm 15$  deg. This plot, generated with a periodic sinusoidal motion imposed on the cylinder, seems to show some hysteresis. This is due to wheel-ground contact compliance and dynamic effects.

Then mechanical constant defined by the ratio between roll angle change and actuator displacement can be then computed for the reference configuration. Figure 5 shows the location of the Instantaneous Centers of Rotation (ICR) between the mechanism parts, including the ground, chassis, and stub axis, labeled respectively (g), (c) and (s).  $I_{ij}$  denotes the ICR of body i with respect to j. The stub axis is considered here as being fixed with the wheel, which rotates around the contact center  $I_{sg}$  with respect to the ground. For double wishbone suspensions with parallel links, the roll center  $I_{cg}$  is found to be on the ground plane. By considering  $I_{wc}$  and  $I_{sw}$ , we can define graphically  $I_{wg}$ , which must be on the intersection of lines ( $I_{cg}$ ,  $I_{sw}$ ).

Let us consider the simplified kinematics of Fig. 6 where the stub axle is assumed to be vertical. The velocity with respect to the ground  $(\vec{v}_{P/g})$  of the attachment point P between the upper wishbone and the transmission vertical link can be decomposed into two components as follows:

$$\vec{v}_{P/g} = \vec{v}_{P/c} + \vec{v}_{P \in c/g},\tag{1}$$

where  $\vec{v}_{P/c}$  is the velocity of P with respect to the chassis, and  $\vec{v}_{P \in c/g}$  is the linear component, expressed at point P, of the twist describing the motion of the chassis with respect to the ground.

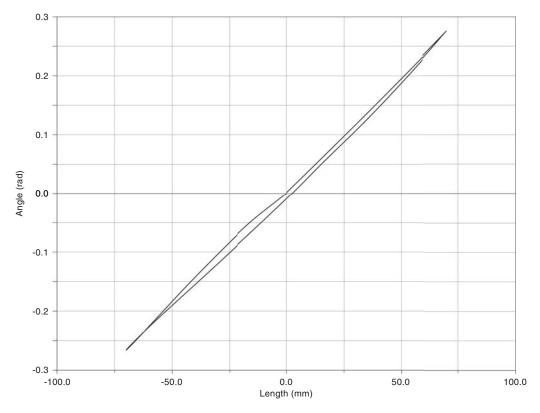


Fig. 4. Mechanical characteristics of the first kinematic configurations: horizontal actuator on the left. Relationship between roll angle and linear actuator displacement.

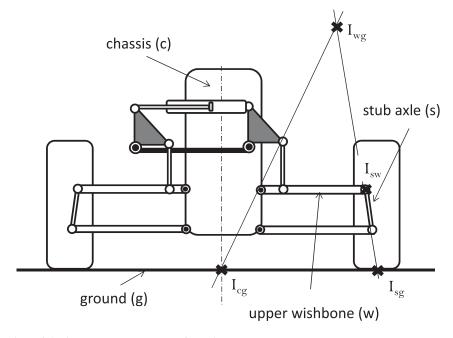


Fig. 5. Location of the instantaneous centers of rotation.

Figure 6 explains how the relationship between the actuator velocity and the roll angular velocity will be found. Let us call v the linear velocity of the actuator. Then, assuming that the rocking levers have the form of isosceles triangles, the velocity w.r.t to chassis of each point P will have a magnitude of  $|\vec{v}_{P/c}| = v/2$  and will be along the vertical direction.  $\vec{v}_{P \in c/g}$  will be orthogonal to the line which

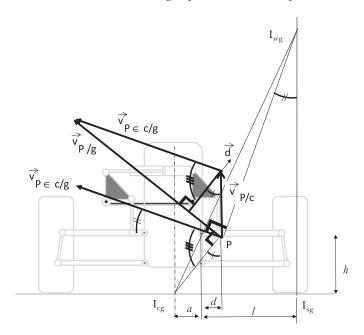


Fig. 6. Composition of the linear velocity of point P, using the relative velocity formula.

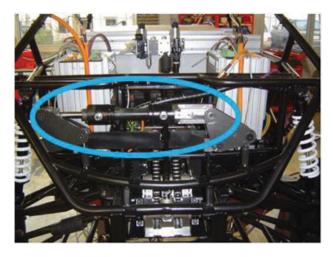


Fig. 7. Anti-roll device mounted on the rover.

connects P to  $I_{cg}$ , and will have a magnitude of  $|\vec{I_{cg}P}|\dot{\phi}$ , where  $\dot{\phi}$  is the roll angular velocity. In addition,  $\vec{v}_{P/g}$  is orthogonal to the line  $I_{wg}P$ .

By projecting the vector equation onto the  $\vec{d}$  direction, and by neglecting the distance d relative to a and l, we find the following approximate relationship between  $v = \frac{d\lambda}{dt}$  and  $\dot{\phi} = \frac{d\phi}{dt}$ 

$$\frac{v}{\dot{\phi}} = \frac{\delta\lambda}{\delta\phi} = k_m = 2d(1 + \frac{a}{l}). \tag{2}$$

Using the numerical value for a, d, l defined in Fig. 2, we find a mechanical constant  $k_m$  equal to 211 mm/rd, which could be compared to 195 mm/s computed using Adams Software. This ratio will be used in the next section for the dynamic model when expressing the force transmission from actuator to platform roll.

Figure 7 shows the real device mounted on the robot; the hydraulic cylinder and the two rocking levers can be identified easily. Considering power and design constraints, this mechanism is reproduced identically on both front and rear axles.

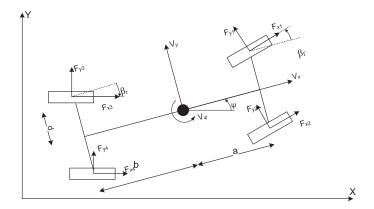


Fig. 8. A four-wheeled vehicle with front steering.

### 3. Vehicle Model

The goal of this section is to develop a vehicle model to design an anti-roll device controller and to provide a measurement for the stability margin. A vehicle is a multi-body system with a complex kinematic architecture having a complex interaction with the ground. However, the number of degrees of freedom of the model can be reduced to achieve a simplified characterization of vehicle dynamics. The dynamics of each wheel suspension (unsprung mass) will not be considered in this model, but an equivalent 1 DOF model of the suspension will be used to represent the roll motion of the sprung mass. <sup>29,30</sup> In the model presented in this paper, only the planar dynamic (Fig. 8) and the roll (Fig. 9) are considered. The model is given by ref. [31]

$$\dot{V}_{x}M = M\dot{\psi}V_{y} - M_{s}h_{p}\dot{\psi}\dot{\phi} + (F_{x1} + F_{x2})\cos\beta_{f} + (F_{x3} + F_{x4})\cos\beta_{r} 
- (F_{y1} + F_{y2})\sin\beta_{f} - (F_{y3} + F_{y4})\sin\beta_{r} 
\dot{V}_{y}M = M_{s}h_{p}\ddot{\phi} - M\dot{\psi}V_{x} + (F_{x1} + F_{x2})\sin\beta_{f} + (F_{x3} + F_{x4})\sin\beta_{r} 
+ (F_{y1} + F_{y2})\cos\beta_{f} + (F_{y3} + F_{y4})\cos\beta_{r} 
\ddot{\psi}I_{z} = I_{xz}\ddot{\phi} + a((F_{x1} + F_{x2})\sin\beta_{f} + (F_{y1} + F_{y2})\cos\beta_{f}) 
+ d((F_{x2} - F_{x1})\cos\beta_{f} + (F_{y1} - F_{y2})\sin\beta_{f}) 
- b((F_{x3} + F_{x4})\sin\beta_{r} + (F_{y3} + F_{y4})\cos\beta_{r}) 
+ d((F_{x4} - F_{x3})\cos\beta_{r} + (F_{y3} - F_{y4})\sin\beta_{r}) 
\ddot{\phi}I_{xs} = M_{s}h_{p}(\dot{V}_{y} + \dot{\psi}V_{x}) + I_{xz}\ddot{\psi} + M_{s}gh_{p}\phi - 2(k_{\phi}\phi + c_{\phi}\dot{\phi}) 
I_{\omega}\dot{\omega}_{i} = C_{mi} - C_{fi} - R_{e}F_{xi}, \quad i = 1, \dots, 4.$$
(3)

In this model (Eq. (3)), the effect of pitching is not include ( $\dot{V}_x = 0$ ) to reduce the complexity of the vehicle model. The front and rear steering angle  $\beta_f$  and  $\beta_r$ , the actuator torque on each wheel  $C_{mi}$  and the braking torque  $C_{fi}$  form the input parameters of the navigation control. The side slip angles of the vehicle are introduced in the expression of lateral force  $F_{yi}$ . Let us define the state variables :  $V_x$ ,  $V_y$  for the longitudinal and lateral velocities,  $V_\psi$  for the yaw rate of the vehicle,  $\phi$  for the roll angle of the sprung mass and  $\omega_i$  for the speed of wheel i. M depicts the total vehicle mass,  $I_{ij}$  are its inertia tensor components,  $M_s$  the sprung mass,  $h_p$  the height of the center of mass with respect to the roll center (see previous section),  $k_\phi$  and  $c_\phi$  are respectively the roll stiffness and damping. These last are related to the stiffness and damping of the spring dampers by linear relationships depending on the geometrical dimensions of the suspension mechanism.

Vehicle dynamics depend on gravity, aerodynamic forces and mainly on ground forces produced by the tires. The interaction forces between the wheel and the ground are generally described by the semi-empirical Pacejka model.<sup>32</sup> If the contact forces are projected on the reference frame of the wheel, as in model (Eq. (3)), we obtain a nonlinear system. The lateral forces  $F_{yi}$  and the longitudinal forces  $F_{xi}$  appear in all equations of model (Eq. (3)) except for the fourth term describing the roll dynamics of the sprung mass. The latter will be used to design a control model for the anti-roll system. First, we recall the model of the vehicle without the anti-roll system. If we neglect the term  $I_{xz}\ddot{\psi}$  in

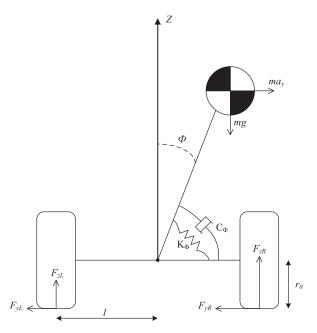


Fig. 9. Vehicle model in the roll direction.

the roll dynamics equation, we can express the fourth equation of model (Eq. (3)) as follows:

$$\dot{x}_{\phi} = \begin{pmatrix} 0 & 1 \\ a_{21} & a_{22} \end{pmatrix} x_{\phi} + \frac{1}{I_{xs}} \begin{pmatrix} 0 \\ M_s g h_p \left( \dot{V}_y + \dot{\psi} V_x \right) \end{pmatrix}, \tag{4}$$

with 
$$x_{\phi} = \begin{pmatrix} \phi \\ \dot{\phi} \end{pmatrix}$$
 state and  $a_{21} = (M_s g h_p - 2k_{\phi})/I_{xs}$  and  $a_{22} = -2c_{\phi}$ .

The second term of equation (Eq. (4)) depends on the lateral dynamics and mainly the centrifugal force  $M_s \dot{\psi} V_x$ , which is given directly by the vehicle horizontal trajectory. This nonlinear part will determine the equilibrium point of the roll angle associated with the null-control.

If we now consider the anti-roll system introduced in the previous section, clearly it does not change the system parametrization. Thus, we can consider a new torque  $u_{\phi}$  due to the cylinder force  $F_a$  as a new generalized force associated with the roll parameter  $\phi$ , which will be added to the other terms of equation (Eq. (4)). Applying the principle of virtual work or kineto-static duality in multi-body rigid systems, we can write

$$u_{\phi} = \frac{\delta \lambda}{\delta \phi} F_a = k_m F_a,\tag{5}$$

where  $k_m$  is the mechanical constant defined in the previous section. The torque  $u_{\phi}$  can be introduced in the fourth equation of the Eq. (3). Then the roll dynamic model can be rewritten as follows:

$$\dot{x}_{\phi} = A * x_{\phi} + B * u_{\phi} + \frac{1}{I_{xs}} \begin{pmatrix} 0 \\ M_{s}gh_{p} (\dot{V}_{y} + \dot{\psi}V_{x}) \end{pmatrix}, \tag{6}$$

with 
$$A = \begin{pmatrix} 0 & 1 \\ a_{21} & a_{22} \end{pmatrix}$$
 and  $B = \begin{pmatrix} 0 \\ 1/I_{rs} \end{pmatrix}$ .

## 4. Controller Design

The goal of the control of the anti-roll system is the minimization of tip-over risks, or the maximization of a stability margin. In our case, the robot cannot control the lateral acceleration because it cannot turn and change direction without undergoing lateral acceleration ( $a_y$  is the consequence resulting

from the steering angles and velocity of the robot). With the anti-roll bar, the roll angle can be controlled as shown in the state model (Eq. (6)) and the center of gravity position can be changed. In order to take into account the stability margin in the controller, a stability criterion expression should be formulated to deduce the reference roll angle  $\phi_{ref}$ .

#### 4.1. Load lateral transfer

Numerous stability margins have already been defined, going from a simple static one based on the minimal distance from the mass center vertical projection to the boundaries of the convex hull support to complex dynamic measurements based on Zero Moment Point (ZMP). However in our dynamic quasi-planar problem, the LLT between the right and left wheels can be used as a measurement of the tip-over risk.<sup>33</sup> Furthermore, the LLT critical threshold is quite easy to tune, since the lift-off of the left or right wheels corresponds to a unitary LLT value. The main objective of the proposed control system will be to stabilize the vehicle by reducing the LLT. It is demonstrated in ref. [22] that

$$LLT = |\Delta F_z| = \left| \frac{M_s g h_p b}{(a+b) d} \phi + \frac{Mh}{d} a_y \right|, \tag{7}$$

where  $a_y$  is the lateral acceleration of the vehicle mass center and, h is its height with respect to the ground surface. Solving the equation LLT = 0, we obtain a reference roll angle  $\phi_{ref}$ 

$$\phi_{ref} = -\frac{Mh(a+b)}{M_{x}gh_{p}b}a_{y}(t) \tag{8}$$

which minimizes the LLT (Eq. (7)).

As can be seen in expression of Eq. (8),  $\phi_{ref}$  depends on the lateral acceleration  $a_y(t)$ . Thus it is necessary to replace the lateral acceleration  $a_y(t)$  by  $a_{y_{ref}}$ . This latter can be computed easily from the reference robot trajectory. In our case the reference path and the desired speed are assumed to be known at this control level. If we neglect the side slip angle of the vehicle mass center, we can determine  $a_{y_{ref}}$  from the path curvature  $\kappa_{ref}(t)$  and the forward velocity  $V_{x_{ref}}(t)$  though the following relationship:

$$a_{y_{ref}}(t) = -k_{ref}(t) V_{x_{ref}}^{2}.$$

$$\tag{9}$$

Then, using the expression of  $a_{y_{ref}}$  in Eq. (9), Eq. (8) becomes

$$\phi_{ref}(t) = \frac{Mh(a+b)}{M_s g h_n b} k_{ref}(t) V_{xref}^2.$$
 (10)

This reference angle is bounded to the extremal values of the roll angle, determined directly by the cylinder stroke. In order to take into account the dynamic constraints and to anticipate future set point changes, an MPC method is used. We start by splitting the control input into two terms, i.e.

$$u_{\phi} = u_{\phi l} + u_{\phi c},\tag{11}$$

where

$$u_{\phi l} = -M_s g h_p \left( \dot{V}_y + \dot{\psi} V_x \right), \tag{12}$$

is a linear decoupling term which can be estimated from the robot on-board sensors. Thus the nonlinear model (Eq. (4)) now takes the following linear form:

$$\dot{x}_{\phi} = \begin{pmatrix} 0 & 1 \\ a_{21} & a_{22} \end{pmatrix} x_{\phi} + \begin{pmatrix} 0 \\ 1/I_{xx} \end{pmatrix} u_{\phi c}.$$

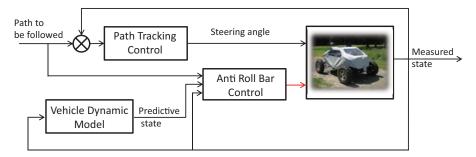


Fig. 10. Block diagram for the proposed model predictive controller.

The continuous-time state space model (Eq. (13)) can be discretized, assuming the zero-order-hold method. We denote by  $T_d$  the sampling period and assume that the state matrix is nonsingular (just verify that  $a_{21} \neq 0$ ). It is easy to calculate an approximate discrete model, based on that for small sampling period. The approximate solution then becomes

$$x_{\phi}(k+1) \approx (I + A * T_d)x_{\phi}(k) + T_d * B * u_{\phi c}(k)$$
 (13)  
  $y(k) = Cx_{\phi}(k)$ .

The equation (Eq. (13)) can be transformed into the following discrete state space model:

$$x_{\phi}(k+1) = A_k x_{\phi}(k) + B_k u_{\phi c}(k)$$

$$y(k) = C_k x_{\phi}(k),$$
(14)

where  $A_k = I + A * T_d$  and  $B_k = T_d * B$  are the state space matrix and  $C_k = (1 \ 0)$ .

# 4.2. Control system

Figure 10 shows a block diagram of the proposed predictive control MPC approach. In this section, the goal for the predictive controller block is to minimize the objective function. Before that can be achieved, we need to estimate first the state of the system in the Vehicle Dynamic Model block.

In order to take into account the estimated state of our robot in the formulation of controller, it must be written with respect to the input and the state.  $\hat{y}_{t+1,t}$  can be described as follows:

$$\hat{y}_{t+1,t} = Cx(t+1)$$

$$= C_k (A_k x(t) + B_k u(t))$$

$$= C_k A_k x(t) + (C_k B_k) u(t)$$

$$= C_k A_k x(t) + (C_k B_k) u(t-1)$$

$$+ (C_k B_k) \Delta u_{t,t}.$$

Then we can deduce  $\hat{y}_{i+1,t}$ , depending on x(t), u(t-1) and  $\Delta u_{i,t}$ . Let consider at instant t the objective function J defined by the following:

$$J\left(x_{\phi}(t), \Delta U(t)\right) = \sum_{i=t+1}^{t+p} \left\|\phi_{i,t} - \phi_{ref_{i,t}}\right\|_{Q}^{2} + \sum_{i=t}^{t+c-1} \left\|\Delta u_{i,t}\right\|_{R}^{2},\tag{15}$$

which represents a weighted sum of the reference tracking errors of  $\phi_{i,t}$  (the predicted value of  $\phi$  at time i computed at instant t) and of control input changes  $\Delta U(t) = \left[\Delta u_{i,t}, \ldots, \Delta u_{t+c-1,t}\right]$ . These latter components are defined by

$$u_{i,t} = u_{i-1,t} + \Delta u_{i,t}. \tag{16}$$



Fig. 11. Adams virtual platform.



Fig. 12. Experimental platform.

Q and R are weighting matrices and p and  $c(c \le p)$  are the prediction time horizon and control time horizon, respectively. After the resolution of the quadratic optimization problem (Eq. (15)), only the first term of  $\Delta U(t)$  is used to compute the control inputs  $u_{\phi c,t}$  of the linearized model that must be applied to the system, that is to say

$$u_{\phi c,t} = u_{\phi c,t-1} + \Delta u_{t,t}. \tag{17}$$

The prediction controller calculates  $\Delta u_{i,t}$  by minimizing the quadratic criterion (Eq. (15)).

$$\frac{\partial J}{\partial \Delta u} = 0. ag{18}$$

This roll controller can be considered as being decoupled from the one dedicated to path tracking. The path controller unit manages trajectory tracking by adjusting the speed and the steering angles that minimize the error between the reference trajectory and the actual position of the robot. The roll controller acts directly on the anti-roll actuator to enhance vehicle stability by minimizing the roll angle and the LLT.

# 5. Results

The MPC controller and the active anti-roll mechanism presented in the previous section were tested. In this section, various results are presented. First, advanced simulation results, obtained from a virtual platform designed using Adams dynamic multi-body software as shown in Fig. 11, are reported. The second part of this section presents the experimental results, recorded with the SPIDO ROBOT platform shown in Fig. 12.

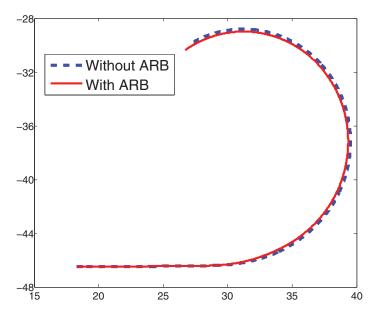


Fig. 13. Robot centre path.

## 5.1. Simulation results

We begin the controller validation by using Matlab-Simulink/ADAMS co-simulation. Adams software computes the vehicle multi-body dynamics, which includes a wheel-ground contact model. The Adams model is a four-wheeled chassis with independent double-wishbone suspensions and with two anti-roll mechanisms integrated on each axle (Fig. 11). The contact model includes wheel stiffness and damping and a regularized Coulomb friction law parametrized by static and dynamic friction coefficients. Matlab-Simulink recovers the Adams output (i.e. the roll angle), computes the optimal control input (i.e. the actuator force) and sends it back to Adams.

The goal of the simulation tests is to quantify the benefits of the anti-roll device, especially when the vehicle performs a cornering maneuver. First, we will present simulation results for a circular path obtained by constant control inputs:  $\beta_f = 12^{\circ}$  for the front steering angle and  $V_x = 5$  m/s for the forward velocity. The circular path starts from instant t = 3 s, and is preceded by a straight-line path for the acceleration phase.

The curves of Figs. 13 and 14 show the robot trajectories and lateral accelerations in both cases, with and without the anti-roll device. By comparing these curves, we can conclude that it is possible to neglect the anti-roll effect on the horizontal robot motion and the availability of path/posture decoupling. This enables us to integrate the anti-roll device without changing the path control signals.

In Fig. 15, we show the normalized lateral load transfer (NLLT) with respect to time for both cases: with and without the anti-roll control. Normalization is done by dividing LLT by the total weight. Thanks to the anti-roll control, the load transfer is minimized:  $NLLT \approx 0.1$ , compared to the passive case where NLLT = 0.45. Curve oscillations are mainly due to the high eigenfrequency introduced by the contact stiffness of the Adams contact model.

For this test, we also present in Fig. 16 the roll angle and the control input, i.e. the actuator force. We can see that the roll control provides a roll behavior which is contrary to the natural behavior (without control). This behavior resembles that of motorcycle racer who leans into the turn for centrifugal force compensation.

The benefits of the active anti-roll system can be further demonstrated when increasing the velocity displacement  $V_x$ . Figure 17 shows the LTT as a function of the vehicle speed and with a constant steering angle. By comparing the vehicle's LLT with and without the active roll device, we can clearly notice the benefits of this system as regards tip-over stability. For the uncontrolled roll case, the robot exhibits instability when the speed reaches 7 m/s; in this case the NLLT exceeds the limit of 1. However, the anti-roll control increases the stability margin of the robot, as the LLT is minimized, opening the possibility for the robot to travel at a speed of greater than 7 m/s with a sufficient safety margin (NLLT remains below 0.5).

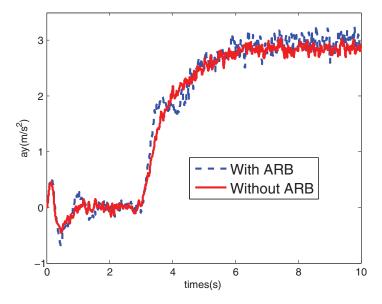


Fig. 14. Lateral acceleration with respect to time.

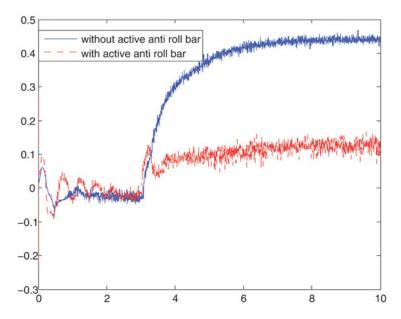


Fig. 15. LLT with respect to time.

## 5.2. Experimental results

The experimental platform is an all-terrain four-wheel-steering vehicle, as shown in Fig. 12. The vehicle weight is 420 kg. The front and rear half wheelbases are 0.62 m and 0.58 m, respectively. It is equipped with a Real Time Kinematic GPS (RTK-GPS) which provides a localization with respect to a reference station which is accurate to within  $\pm 2$  cm. The active anti-roll bar (AARB) is easily integrated into the UGV, since it only requires an adequate hydraulic power system, with minor modifications to the structural design of the UGV.

An analysis of the influence of the AARB on the overall performance of the UGV is performed by first studying its impact on the trajectory tracking task. A comparison is made between two identical experimental trial scenarios with the same trajectory tracking control, with the exception that in one case the AARB is activated while in the other it is disabled or rendered transparent as discussed earlier. Figures 18 and 19 show the trajectory of the center of mass of the robot at different speeds. Observation of the results shows that the trajectory of the robot is not disturbed by the AARB. In Figs. 18 and 19 the two trajectories for the UGV with and without the AARB are almost superimposed,

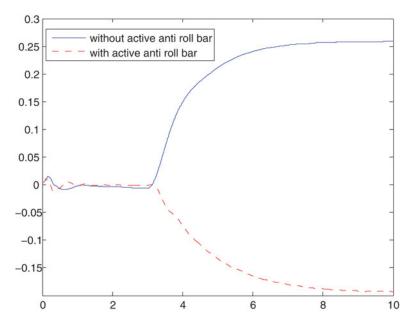


Fig. 16. Roll angle.

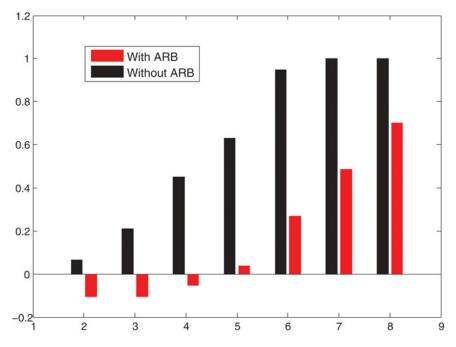


Fig. 17. Normalized lateral load transfer as a function of robot speed.

though the activation of the AARB enables a better tracking of the reference trajectory. The UGV's trajectory at 5 m/s and 8 m/s is slightly better when the AARB is enabled, as shown in Figs. 18 and 19. This slight difference becomes visible when cornering, because the roll angle of the UGV is not the same as that shown in Figs. 20 and 21.

Initial observations show that by activating the AARB, the UGV can tilt towards the interior of the curve, hence increasing roll stability. On the other hand, when the AARB is deactivated the UGV tilts outwards during turning, as shown in Figs. 20 and 21, which progressively increases the roll-over risk. Figures 20 and 21 show a relatively small roll angle at 5 m/s, but a significant roll angle is observed at 8 m/s, depicted by the blue line. The activation of the anti-roll bar has a direct impact on the roll angle. Moreover, the center of mass of the UGV moves from the left (the outside of the

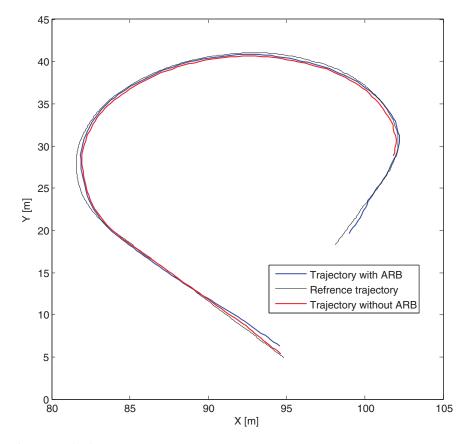


Fig. 18. Trajectory at 5 m/s.

corner), represented by the blue line in the figure, to the right (the inside of the corner), represented by the red line, with and without the AARB, respectively.

This balancing of the roll angle of the frame of the robot directly generates a variation in the LTT. Figures 22 and 23 show a clear difference in the vehicle state between the activated and deactivated modes of the AARB. From the observation of the variations in the value of the LTT at 5 m/s we can deduce that the absolute value of the LLT defined in Eq. (7) is less when the AARB is active (shown in red) than when the AARB is deactivated (blue). Once the speed reaches 8 m/s while cornering, the stability limit is reached as the |LLT|=1. This limit of stability or instability is detected from the curvilinear abscissa 40 m to 70 m as show in Fig. 23. We can deduce that the robot is unstable from the beginning of the turn when it start changing direction without the AARB. The lateral robot instability seems that one side of the vehicle (right or left) loses contact with the ground (unitary value of the LLT, |LLT|=1). In this situation, a significant difference is observed in the vehicle's performance between the use of the AARB and the deactivated case. This mainly due to the fact that without the AARB the UGV reaches the stability limit at 41 m on the curvilinear abscissa, while by employing the AARB the stability limit is reached at 47 m, making a 6-m difference. Moreover, peaks are observed on the LLT curves, representing the instants where the UGV loses contact with the ground. This is a phase where the robot is no longer controllable. These extreme situations disappear when the AARB is activated, hence increasing stability since the UGV stays within the stability limit zone of LLT=1 while remaining in contact with the ground for the four wheels.

Finally, we can conclude this analysis by observing the slip angle. This variable characterizes a phenomenon that is essential in changing the direction the vehicle and which quickly turns into a source of instability when it exceeds certain limits. In our analysis of the experimental results, we noticed a slight difference in the trace of the slip angle between the cases of an activated and deactivated AARB. This difference is proportional to the speed of vehicle (Figs. 24 and 25).

This observation is confirmed by the cornering stiffness trace. The activation of the anti-roll bar induce a remarkable decrease in the variation of  $C_f$  and  $C_r$  as shown in Figs. 27 and 29, in Figs. 26

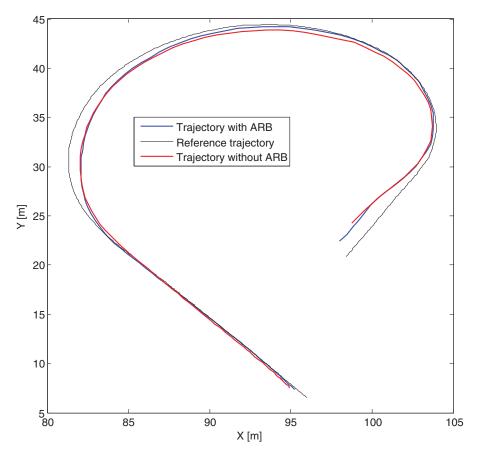


Fig. 19. Trajectory at 8 m/s.

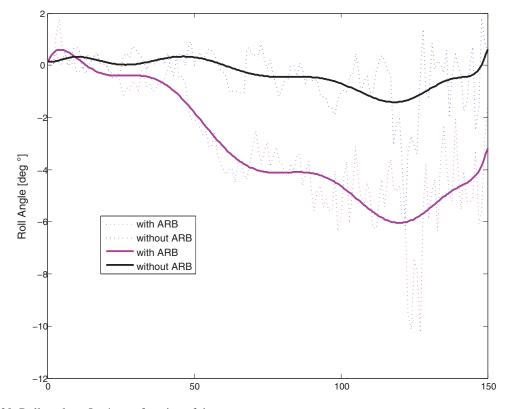


Fig. 20. Roll angle at 5 m/s as a function of time.

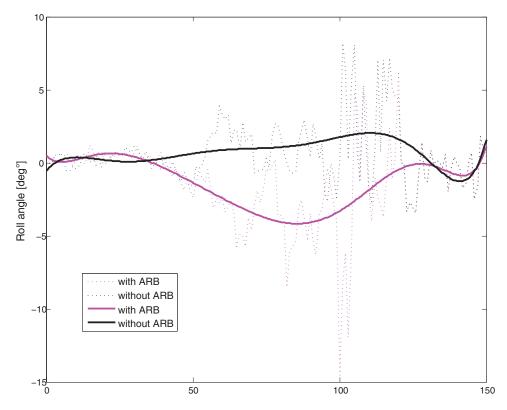


Fig. 21. Roll angle at 8 m/s as a function of time.

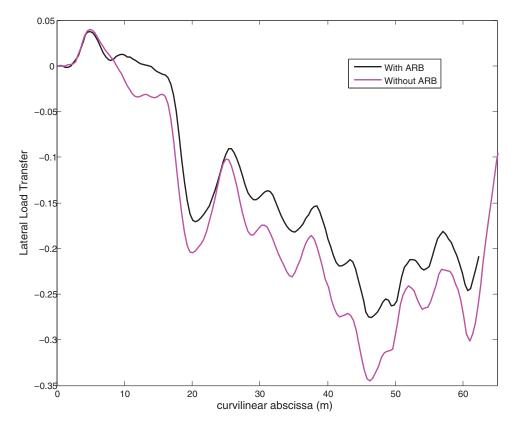


Fig. 22. Normalized lateral load transfer LLT at 5 m/s.

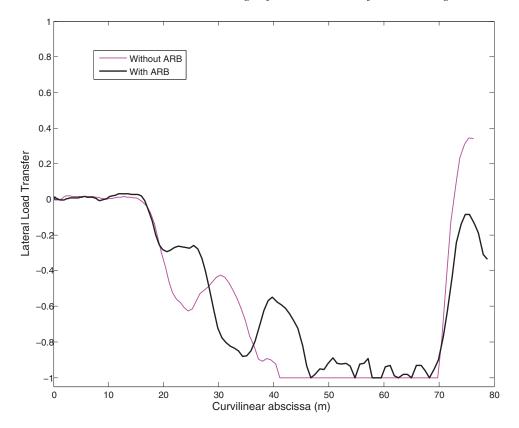


Fig. 23. Normalized lateral load transfer *LLT* at 8 m/s.

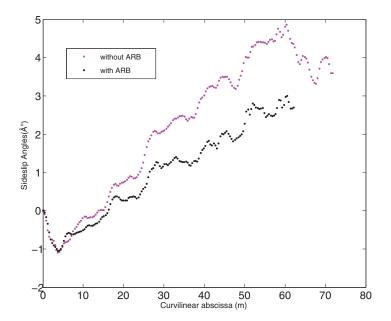


Fig. 24. Slip angle at 5 m/s.

and 28, respectively. This variables are deduced from the previous work of Lenin *et al.* in ref. [34]. The cornering stiffness and the side-slip angles are estimated online with a kinematic and dynamic observer respectively. Based on the Pacejka study of the variation in the curve slope  $F_y = f(\alpha)$  according to the vertical load  $F_z$  in ref. [32], we can deduce that the minimization of the LTT on a

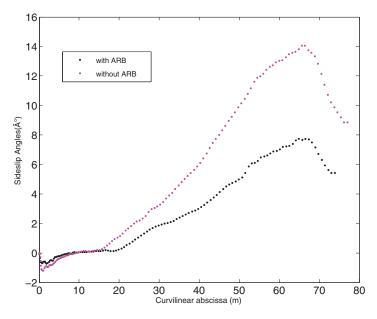


Fig. 25. Slip angle at 8 m/s.

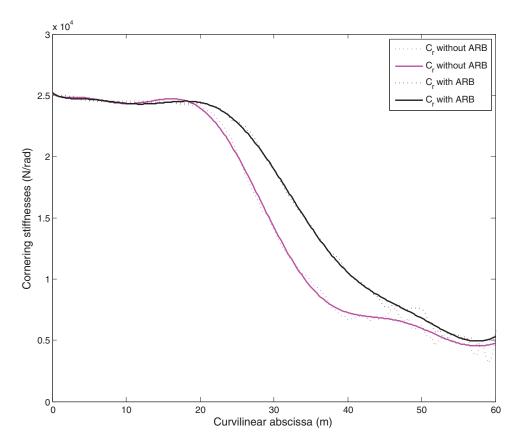


Fig. 26. Cornering stiffness at the rear of the robot at 5 m/s.

bend or on inclined ground generates a minimization of cornering stiffness variation, and therefore reduces sliding on the whole robot. This provides us with the perspective of studying the effect of the anti-roll bar on the stability of the robot.

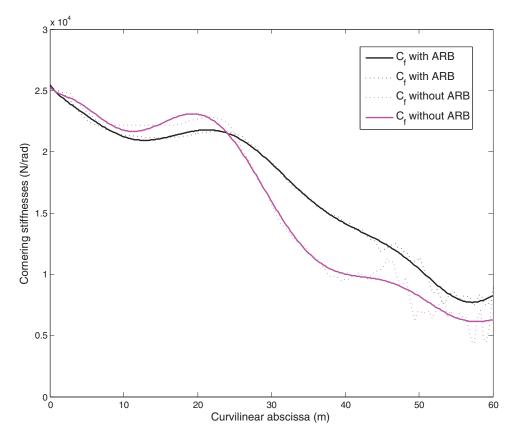


Fig. 27. Cornering stiffness at the front of the robot at 5 m/s.

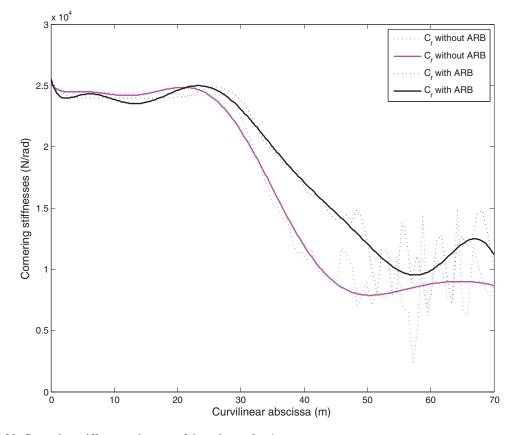


Fig. 28. Cornering stiffness at the rear of the robot at 8 m/s.

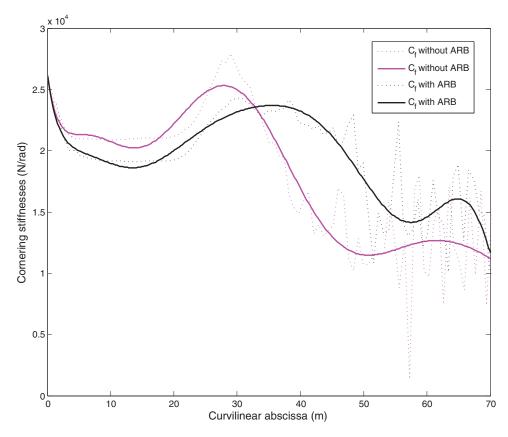


Fig. 29. Cornering stiffness at the front of the robot at 8 m/s.

## 6. Conclusion

In this paper, an integrated approach to designing an active anti-roll system was presented. An innovative kinematics scheme, which can easily be added to an existing off-road chassis, is proposed. It can replace the standard anti-roll bar used on most vehicles. The input  $u_{\phi}$  improves the controllability of the lateral dynamics of the vehicle and makes it possible to control the roll angle. The reference roll angle was generated by maximizing the LLT stability margin. In order to take into account the discontinuity and the variations in input, an MPC based on the minimization of load transfer and energy consumption was designed. Simulation results show that this system improves the performance and stability of the robot when cornering. The experimental results, recorded using the SPIDO ROBOT platform, confirm the simulation results. Moreover, the proposed system allows the robot to increase its velocity in the turn. An important advantage of the proposed solution is its easy integration as a replacement part, without any transformation of the original chassis. This system can be controlled independently, and is demonstrated to have no effect on the dynamics of the path controller.

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