

CURVED PATH FOLLOWING OF A FARM TRACTOR USING A CP-DGPS

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Abstract: Precision agriculture involves very accurate farm vehicle control along recorded paths. Such repetitive tasks could be handled using Automatic Guided Vehicles (AGV). In this paper, we address the problem of farm tractor control using a single CP-DGPS receiver. A non linear, velocity independent control law has been designed to perform both curved paths and straight lines following. It relies upon the kinematic model of the farm tractor. The control law has been implemented on a commercial farm tractor. Step response as well as curve following are presented and discussed. *Copyright©2000 IFAC*

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1. INTRODUCTION

Precision farming can be described as a three steps process. Land surveying is the first one, while agricultural maps recording is the second one. According to the previous steps, the last one could be variable rate seeding, fertilizing,... We will focus on the third step, as it requires an accurate vehicle guidance. Let us illustrate this concept in the particular case of a farm tractor. The need for automatic vehicle guidance systems seems obvious on this machine: the driver would only have to finely tune different functions of this machine. Meanwhile, the guidance system would achieve a very accurate positioning, thus insuring neither overlapping nor missing areas.

Many agricultural situations could be reported. Most of them could be classified as two categories. The first one is a "previously-recorded" path-following task: this trajectory could have

been stored during the seeding for instance, and replayed during weeding. In the second one, the machine must follow a new curve. This curve is computed from the last passage plus an offset (the tool length for instance). We could also mention new possibilities, such as automatic half-turn for driver assistance. All these situations require a control along curved paths.

Many experiments have been conducted and reported in the literature. Most approaches can be classified into two categories, as they rely upon two kinds of sensors and information.

1.1 *Relative information and guidance systems*

The first one uses relative information. Researchers have focused for instance on the video camera sensor. Mounted at the end of the implement or at another appropriate location, it

provides the operator with a set of "eyes" near the reference line, for instance, a sugar beets row. This contact-free sensing system presents the same offset information as earlier furrow following or edge-detecting sensors: the reference line to be followed by the vehicle is not the one extracted in the video image. Moreover, it has a challenging feature from a control point of view: it provides anticipation to the control system, since the camera is scanning ahead of the vehicle. Various approaches have been tested. Some rely on 2D information extracted from the image plane (Debain, 1996), (Khadraoui *et al.*, 1998) and (Ollis and Stentz, 1997). Other are based on 3D sensors, for instance made of a laser scanning and a video camera (Chateau *et al.*, 1999). Two kinds of difficulties arise: the first one is the reference extraction. The whole guidance system relies upon the quality and robustness of the image processing algorithms. Extreme conditions of dust, for example, reveal the weakness of the detection side. The other problem arises when the new reference is computed in an iterative way from the previous one. The automatic guidance system can lead to oscillations. In the same situation, human operators frequently and periodically sacrifice for efficiency. They do not exactly follow the previous path, and often "straighten out" the edge of the worked area.

1.2 Absolute information and guidance systems

The second one uses absolute information. A recent technological development allows accurate three dimensional (3D) positioning of the vehicle in a field without the need for buried cables, field-installed beacons or video sensors: the Global Positioning Systems (GPS). For instance, during the harvest, corn weight measurement devices are coupled to a differential GPS to produce a yield map. It allows farmers to adjust seed, pesticide, and fertilizer to each field location.

State of the art DGPS (Carrier Phase DGPS or CP-DGPS) reach the real-time centimeter accuracy. This allows the design and implementation of an absolute vehicle guidance system with the availability of a very accurate positioning system. This technology can be used in special operations, in which the vision system is unable to proceed, for instance, in a spraying or fertilizing operation with no visible markers such as boom wheel tracks or foam marks. Researches have been carried out in this area, using fiber optic gyroscopes (FOG) and GPS (Nagasaka *et al.*, 1997). The influence of navigation sensors in GPS based land navigation has also been studied in (Abbot and Powell, 1999). Promising results have been reported where an "all-GPS" solution has been preferred: with multiple GPS (O'Connor *et al.*, 1996) or with one GPS (Cordesses *et al.*, 1999).

We will first introduce the reader with the kinematic model of the farm tractor, with respect to a curved reference. We will then propose a non linear, velocity independent control law designed for curved paths following. A brief description of the straight line case will be derived. Lastly, we will describe our implementation and experimental setup on a farm tractor. Experimental results will be presented and some conclusions will be drawn.

2. VELOCITY INDEPENDENT CONTROL LAW FOR CURVE FOLLOWING

In the scope of this paper, we will focus on the particular case of a farm tractor. Most agricultural tasks are performed at constant velocity. Unfortunately, this velocity relies upon various factors, such as crop variety and soil properties, and is tuned by the driver. This is the reason why we decided to design a velocity independent control law. Such an approach has been addressed in (Elkaim *et al.*, 1997). We will present here a different solution.

After a brief presentation of the non linear kinematic model of the farm tractor, we will derive our velocity independent control law for curved path following. We have to mention that we will focus on the path following aspect of the guidance system, while not dealing with the path planning step. In fact, the reference is assumed to exist, as previously stated.

2.1 Kinematic model of the tractor with respect to a curved reference.

Let (zWx) be an absolute frame. The reference path is assumed to be a curve \mathcal{C} in this frame. We will denote s the curvilinear abscissa along \mathcal{C} , $c(s)$ the path curvature, and $g(s) = \frac{dc(s)}{ds}$.

The farm tractor model is assumed to match a tricycle model of length l with a controlled front wheel (figure 1). We chose to put the tractor control point at the center of the rear axle, denoted O . Many reasons have led us to use this point. Most of them derive from practical implementation issues :

- O is the tractor closest point to the rear implement. We are highly interested in gathering data sensed near the implement, since it performs the agricultural task.
- The GPS antenna must be on the top of the tractor cabin, to see more satellites. Since the control point has to be straight down the antenna, point O suits well.

The last reason is a theoretical one. This point O shows special control properties, and therefore

is widely used to deal with the control of car-like systems (Samson, 1995), (Tilbury *et al.*, 1995).

Finally, as in (Samson, 1995), we will denote y the distance between O and the closest point M of \mathcal{C} . We assume that point O location is always described by a unique couple (s, y) . This assumption is valid in real world experiments as long as the tractor remains close to the reference path.

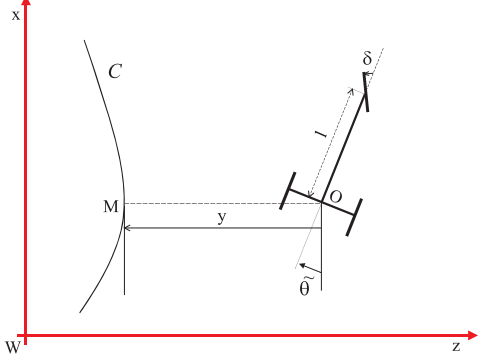


Fig. 1. Kinematic model of the farm tractor

The configuration of the tractor is thus described without any ambiguity by the state vector $\underline{X} = (s, y, \tilde{\theta})^T$ with :

- s : the curvilinear abscissa of point M
- y : the lateral deviation of the tractor with respect to the reference path.
- $\tilde{\theta}$: the heading of the tractor with respect to the reference path. It can be described as the angle between the tractor body and the reference tangent at point M .

Two control variables are available, namely $\underline{U} = (v, \delta)^T$ with:

- v : linear velocity at point O (the control variable is actually the rotation velocity of the rear wheels, from which the value of v can be inferred).
- δ : orientation of the front wheels (assumed to be superposed, see figure 1).

The vehicle kinematic equations are derived according to celebrated pure rolling and non-slipping assumptions, and rigid body assumptions. The former imposes that the linear velocity vector at point O is directed along the vehicle axle. The latter implies that an instantaneous rotation center exists. It has then been proved (see (Samson, 1995)) that the model can write as (for the sake of simplicity, $c(s)$ and $g(s)$ are written hereafter c and g):

$$\begin{cases} \dot{s} = \frac{v \cos \tilde{\theta}}{1 - cy} \\ \dot{y} = v \sin \tilde{\theta} \\ \dot{\tilde{\theta}} = v \left(\frac{\tan \delta}{l} - \frac{c \cos \tilde{\theta}}{1 - cy} \right) \end{cases} \quad (1)$$

The equations are clearly non linear. They become singular when $y = \frac{1}{c}$. This means the point O is located at the center of curvature of the reference path. This problem is not encountered in practical situations: the path curvature is small and the farm tractor remains close to the reference.

2.2 Design of a velocity independent control law

Farm tractor control along curved paths has already been addressed in some particular cases (Bell *et al.*, 1997). We use hereafter a more general approach: we convert the non linear model (1) into a chained form. Such an approach is interesting as it allows us to use, for a large part, linear systems theory, while still relying upon the non linear model of the plant.

A three dimensional chained form writes as:

$$\begin{cases} \dot{a}_1 = m_1 \\ \dot{a}_2 = a_3 m_1 \\ \dot{a}_3 = m_2 \end{cases} \quad (2)$$

with $\underline{A} = (a_1, a_2, a_3)^T$ and $\underline{M} = (m_1, m_2)^T$ respectively the state and control vectors. In order to convert the farm tractor model (1) into chained form (2), let us impose:

$$a_1 = s$$

In order to match (2), the new control m_1 necessarily writes as:

$$m_1 \triangleq \dot{a}_1 = \frac{v \cos \tilde{\theta}}{1 - cy} \quad (3)$$

Moreover, let us impose:

$$a_2 = y$$

We have:

$$\dot{a}_2 = v \sin \tilde{\theta} \triangleq a_3 m_1$$

Therefore we must choose:

$$a_3 = (1 - cy) \tan \tilde{\theta}$$

and the last control variable m_2 is given by:

$$\begin{aligned} m_2 \triangleq \dot{a}_3 &= \frac{d}{dt}((1 - cy) \tan \tilde{\theta}) \\ &= -c v \sin \tilde{\theta} \tan \tilde{\theta} - g \frac{v \cos \tilde{\theta}}{1 - cy} \tan \tilde{\theta} y \\ &\quad + \frac{(1 - cy)v}{\cos^2 \tilde{\theta}} \left(\frac{\tan \delta}{l} - c \frac{\cos \tilde{\theta}}{1 - cy} \right) \end{aligned} \quad (4)$$

In conclusion, the non linear tractor model (1) can be converted into chained form (2) according to the state transformations:

$$\underline{A} = \Theta(\underline{X}) \text{ with } \Theta(\underline{X}) = (s, y, (1 - cy) \tan \tilde{\theta})^T$$

and the control transformations:

$$\underline{M} = \Upsilon(\underline{U}, \underline{X}) \text{ defined by (3) and (4)}$$

This chained form can be used to design a control law as long as these transformations are invertible,

i.e. $v \neq 0$ and $\tilde{\theta} \neq \frac{\pi}{2} [\pi]$. From a practical point of view, once properly initialized, the guided tractor respects these conditions.

In order to get a velocity independent control law, we now replace the time derivative in (2) by a derivation with respect to the curvilinear abscissa s . The normalized model becomes:

$$\begin{cases} a'_1 = 1 \\ a'_2 = a_3 \\ a'_3 = m_3 \end{cases} \quad \text{with} \quad m_3 = \frac{m_2}{m_1} \quad (5)$$

The lower part of model (5) is completely linear, so it can be brought to zero using the following virtual control law:

$$m_3 = -K_d a_3 - K_p a_2 \quad (K_p, K_d) \in \mathcal{R}^{+2} \quad (6)$$

As a matter of fact, reporting (6) in (5), leads to:

$$a''_2 + K_d a'_2 + K_p a_2 = 0 \quad (7)$$

which implies that both a_2 and a_3 , and therefore y and $\tilde{\theta}$ converge to zero.

The above error dynamics is expressed with respect to s . So, for any given (K_p, K_d) , the resulting trajectories remain identical, even if v is varying. This control law is then clearly velocity independent.

Reporting (6) in (3) and (4), the real control is:

$$\delta(y, \tilde{\theta}) = \arctan \left(l \left[\frac{\cos^3 \tilde{\theta}}{(1 - cy)^2} (gy \tan \tilde{\theta} - K_d (1 - cy) \tan \tilde{\theta} - K_p y + c(1 - cy) \tan^2 \tilde{\theta}) + \frac{c \cos \tilde{\theta}}{1 - cy} \right] \right) \quad (8)$$

The above $\delta(y, \tilde{\theta})$ is not bounded, and thus, the control law does not prevent from actuator saturation. It is quite simple to bound the virtual control law m_3 to any arbitrary value. Nevertheless, it leads to a bounded δ only if the trajectory to be followed exhibits some good properties. This is true, for instance, for a circle, where $g = 0$ and c is constant. The theoretical stability of the closed loop system is still insured, since the chained system is a double integrator (see (Sussmann *et al.*, 1994)).

2.3 The straight line case

This curved path control law can be gracefully degraded to the case of straight line following. A straight line reference imposes both $c = g = 0$. The control law (8) then becomes:

$$\delta(y, \tilde{\theta}) = \arctan(l \cos^3 \tilde{\theta} (-K_d \tan \tilde{\theta} - K_p y)) \quad (9)$$

When we saturate m_3 using a sigmoid, the expression of the control law turns to:

$$\delta(y, \tilde{\theta}) = \arctan \left(K l \cos^3 \tilde{\theta} \frac{1 - e^{-k(K_d \tan \tilde{\theta} + K_p y)}}{1 + e^{-k(K_d \tan \tilde{\theta} + K_p y)}} \right) \quad (10)$$

This control law is clearly saturated: K can be tuned so as to ensure: $\max_{y, \tilde{\theta}} |\delta(y, \tilde{\theta})| = \delta_{max}$. Such a control law has been previously designed and used to control a combine harvester along straight lines in a field (Cordesses *et al.*, 1999).

3. EXPERIMENTAL RESULTS

Experiments have been carried out on a farm tractor in our experimental farm in Montoldre, France.

The CP-DGPS dual frequency receiver is a Dassault-Sercel unit: Aquarius 5002 system. Its claimed accuracy is about 1 cm, and its upper sampling frequency is 10 Hz. Three dimensional velocities are computed thanks to Doppler measurements. Its short initialization time allows its use in many farm applications.

The controller has been implemented in high level language (C++) on a Pentium based computer.

3.1 Implementation of a state measurement unit

Both control laws (8) and (9) require lateral deviation y and heading error $\tilde{\theta}$.

Since the GPS antenna is straight up the point O , the receiver only provides us with the 3D position and velocity of that point.

The y measurement is easily obtained from the knowledge of the reference path and the O coordinates. The $\tilde{\theta}$ is more complex to derive. A common and costly solution makes use of additional hardware and sensor (either a gyroscope or an attitude measurement unit). We have preferred a cheaper approach based upon our only exteroceptive sensor, the CP-DGPS receiver. Under the previously mentioned pure rolling and non-slipping assumptions, one can easily infer the heading of the farm tractor thanks to realtime velocity data.

3.2 Step response of the system

Although a step path is not common in agriculture, we have used the step response to check the behaviour of our closed loop system. All the experiments have been conducted on an almost flat ground with the straight line control law (10).

The very first experiments have been carried out with a 2 meters step at 8 km/h. One can compare on figure 2 simulation and experimental results.

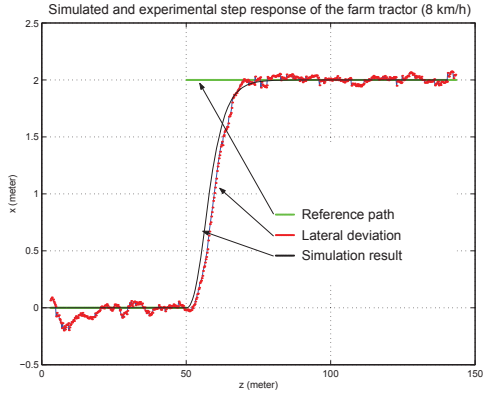


Fig. 2. Simulation and experimental trajectory at 8 km/h

We have also checked the velocity independence property. Experiments have been conducted at 4 and 8 km/h (constant velocity) and from 4 to 8 km/h (varying velocity). One can check on the upper curve of figure 3 that the three step responses almost perfectly overlap. The lower curve plots the raw velocity as computed by the GPS receiver. One can notice the sound behaviour of the farm tractor during all these experiments.

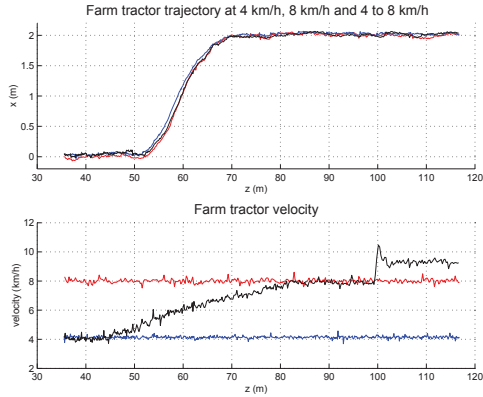


Fig. 3. Velocity independence validation

Standard deviation from the mean σ_x , and bias μ_x of the lateral deviation for these experiments are summed up in table I. One can notice that the results appear quite satisfactory ($\sigma_x < 3.1$ cm and $\mu_x < 2.7$ cm).

Table I. Bias and standard deviation from mean

velocity ($km.h^{-1}$)	4	8	4 to 8
μ_x (cm)	2.7	0.3	2.1
σ_x (cm)	1.9	3.1	3.1

3.3 Curve following

Up to now, we have only validated the straight line following law. In the sequel of these experiments, we now investigate the curved path following control law (8).

We first recorded in open loop a reference path, roughly made of straight lines and a quarter of circle (figure 4).

The closed loop experiments with respect to this new path started with a 0.8 m lateral deviation (see figure 5 at initial time). One can notice that the farm vehicle has converged to the reference path (both curves overlap on figure 5). The bias is about 3 cm and the standard deviation from the mean less than 5 cm. Moreover, the maximum lateral deviation along the whole path is 18.4 cm (see figure 5 at time $t = 30$ s). The curvature of the reference path at this time is the highest one, thus leading to a δ varying very quickly.

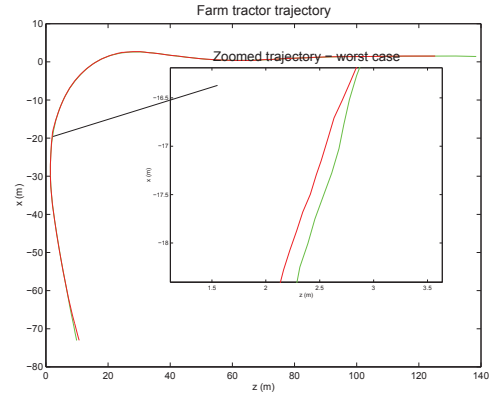


Fig. 4. Reference path and closed loop, farm tractor trajectory

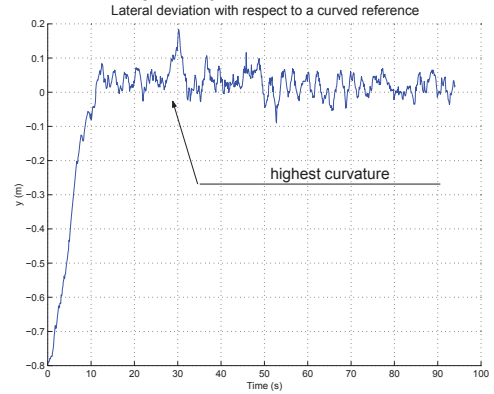


Fig. 5. Lateral deviation with respect to the curved reference

Such a behaviour can be explained. Our investigations have led us to incriminate the low level serving system. First of all, one must keep in mind this system does have a response time (a few hundreds of milliseconds). Moreover, it has not been optimized for fast tracking: neither the hydraulic components nor the controller - off the shelves devices - can achieve very high performances.

We have recorded a second reference path: it is longer than the previous one, and crosses different types of ground (figure 6). Thorough analysis of the lateral deviation leads to the same conclusions.

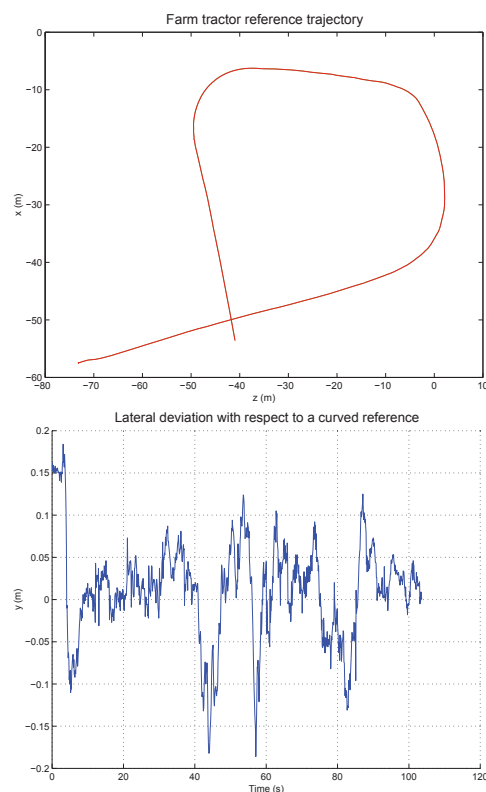


Fig. 6. Second reference path

4. CONCLUSION

The purpose of this work was to control a farm tractor along a curved path, using a CP-DGPS sensor.

We first built a non linear control law using a chained form of the kinematic model of the farm tractor. Moreover, it has been designed so as to be velocity independent for practical reasons.

We have implemented this control law on a farm tractor. Curved path following has been demonstrated. We have also checked the velocity independence property.

Although results are quite satisfying on an almost flat ground, further research has to be done to take into account for slope. One can also mention the use of other sensors to insure a highest level of reliability, and thus security.

Another important issue is to build a better hydraulic servoing system, in order to decrease both latency time and response time. One could also take into account for the latency of the whole vehicle thanks to an anticipatory system.

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