



CORPUS PUBLISHERS

Archives of Agriculture Research and Technology (AART)

Volume 1 Issue 1, 2020

Article Information

Received date: March 16, 2020

Published date: April 13, 2020

*Corresponding author

Jaime Cuauhtemoc Negrete, Department of agricultural mechatronics, Autonomous Agrarian Antonio Narro University, Mexico

Distributed under Creative Commons
CC-BY 4.0

Keywords Kalman Filter; México;
Agriculture; Automation; Autonomous
Guidance System; Agricultural Vehicles

Research Article

A Kalman Filter Uses in Mexican Agriculture

Jaime Cuauhtemoc Negrete*

Department of agricultural mechatronics, Autonomous Agrarian Antonio Narro University, Mexico

Abstract

Currently, any country on the planet has problems feeding its population, which is getting bigger every day. Due to this situation, researchers dedicated to food production are increasingly pressured to increase their production, for this they make use of any technique that can help them; new technologies seem to be the only viable alternative. From the reviews carried out in articles from other countries, the use of this method in navigation systems is notoriously important. In Mexico, as this field is incipient, the application of the Kalman filter is also used for other types of research such as irrigation, agricultural economics agrometeorology and models of crop growth as researchers focus on more current topics such as aerial and land unmanned agricultural vehicles the use of this important tool will also be greatly increased due to its benefits and applications in navigation.

Introduction

Currently, any country on the planet has problems feeding its population, which is getting bigger every day. Due to this situation, researchers dedicated to food production are increasingly pressured to increase their production, for this they make use of any technique that can help them; new technologies seem to be the only viable alternative. Mexico does not escape the aforementioned, therefore the automation of agriculture, livestock and other production biosystems such as greenhouses [1] seems to be an option currently, through the Internet of Things[2] mechatronics [3], machine vision [4,5]. The use of drones and other autonomous vehicles [6], within the latter, autonomous navigation is important and within this, the use of the kalman filter is of great importance, which is why this bibliographic research work was carried out.

Materials and Methods

Was made use of a review of academic articles, textbooks, internet materials, news articles and publicly available materials on housing problems. A systematic and thorough search was conducted for data collection in printed databases, Internet, magazines scientific, graduate and postgraduate university thesis, newspaper articles, etc. The method used is a review of academic articles, textbooks, internet materials, news articles and publicly available materials.

Literature Review

The Kalman filter is an efficient, recursive, mathematical algorithm that processes, at each step, inaccurate observation input data and generates a statistically optimal estimate of the subjacent real system state, by employing a prediction model and an observation model. Rudolf E. Kalman in 1960 developed it and it is an algorithm that serves to identify the hidden state (not measurable) of a linear dynamic system, when the system is subjected to additive white noise, it is a recursive algorithm, it can run in real time using only current input calculations, the previously deduced state and its uncertainty matrix, and does not demand any other additional information, it has numerous applications in technology [7]. A common application is the guidance, navigation and control of vehicles, mainly spaceships. Furthermore, it is widely used in fields such as signal processing and econometrics (Table 1).

Kalman Filter in Mexican Agriculture

In our country, the kalman filter has been used recurrently in agricultural research, in different fields from irrigation, economics, plant growth models, to autonomous navigation in agricultural vehicles; Ruiz[8] developed the NICOLET model to predict biomass production and nitrate content of lettuce production, and used the kalman filter is a suitable method to provide the required automatic adaptation to time-varying phenomena in complex crop models. Sanchez [9] presents a methodology based on space-time geostatistics for the optimal design of automated monitoring networks, using as optimization criteria to reduce the variance of the error in the estimation of groundwater levels in certain space-time positions given a frequency fixed monitoring; Using the Kalman filter, the variance of the error in the estimation was calculated based on the position of the monitoring sites, without the need to know the data measured in the field. Begovich [10] implemented and evaluated in real time an optimal LQG controller, to regulate; In the face of variations in the flow entering, the canal, the levels upstream of the gates in a four-channel irrigation channel prototype, using an upstream control, also made use of the Kalman filter. Loría[11] estimated the dynamic relationship between the unemployment rate and the Mexican product, with annual data (1970-2004). I use three time series structural models with the Kalman filter. Serrano [12] implemented the Kalman filter to estimate the states and outputs of the dynamic growth model of lettuce (*Lactuca Sativa*) NICOLET B3 from real measurements with simulated random disturbances that allowed validating the model. Ruiz [13] applied an Optimal Linear Gaussian regulator in the downstream control of a two-section laboratory channel. Ortiz [14] presents robust simultaneous mapping and mapping applied to trajectory planning, in other words, a technique for the problem of autonomous navigation of nonlinear systems. It is proposed to modify the Extended Kalman Filter using the first-order sliding mode theory that has the characteristic of being robust to bounded disturbances and uncertainties in mathematical models. INECC [15] Present the Economic Modeling of the Agriculture, Forestry and Other Land Uses sector (AFOLU) for estimating greenhouse gas emissions and short-lived climate compounds. The simulations were built using an algorithm that combines the Metropolis-Hastings algorithm and the Kalman filter. Perez [16] Present out a work designed for the use of the Discrete Kalman Filter algorithm that helps alert or knowledge of possible hydro meteorological phenomena for the central basins of the state of Veracruz. Gutierrez [17] presented the results obtained by implementing an extended Kalman filter to estimate the orientation states of a quadcopter. These states are assumed to be measured through an accelerometer and a gyroscope, both measurements presenting channel noise. First, the model used for the flight simulation is shown, which is non-linear, so to use the Kalman Filter algorithm it is necessary to linearize and discretize

**Table 1:** Kalman Filter in World Agriculture.

Author	Description	Year
Ming Li	Mentions that this computational method is necessary to improve usage of the integration of gps with Inertial Navigation System (INS) in the autonomous guidance system of agricultural vehicles	2009
Yuliang Zhang	Describes a numerical robust and computational efficient square-root central difference Kalman filter (SRCDKF) and put it into the application of state estimation of Inertial Navigation System (INS)/GPS integrated navigation for wheeled agricultural robot to overcome the flaws exist in EKF (Extended Kalman Filter).	2008
Freitas	Addresses the refactoring of an agricultural vehicle localization system and its deployment and field-testing in apple orchards. It employs an Extended Kalman Filter to integrate the information from the sensors, with the pose being predicted via encoder odometry and updated via point and line features detections	2012
Laia	Use of unscented Kalman filter with neural networks in a dual estimation filtering: a filter for state estimation and a filter for weight estimation with the objective of obtaining better quality in the signal / noise relation of Agricultural soil tomographic projections	2008
D. Wu	Presents an adaptive steering controller using a Kalman estimator for wheel-type agricultural tractors for achieving accurate and prompt steering control with noisy steering command signals and drifting valve characteristics on an automated agricultural tractor with an electrohydraulic steering system.	2001
Oksanen	Improved tractor positioning with a cheap GPS-receiver by using inertial navigation and odometry. Kalman filtering is used for sensor fusion	2005
Southall	Presents a work concerned with a machine vision system for an autonomous vehicle designed to treat horticultural crops. The vehicle navigates by following rows of crop (individual cauliflower plants) that are planted in a reasonably regular array typical of commercial practice. We adopt an extended Kalman filter approach where the observation model consists of a grid, which is matched to the crop-planting pattern in the perspective view through the vehicle camera.	2002
Anadranistakisa	Developed a correction method for the provision of accurate near-surface temperature and humidity forecasts, based on the combination of a Kalman theory filtering technique and an empirical method with exponential smoothing.	2004
CHEN	Introduced a PyWOFOST model based on Ensemble Kalman Filter (EnKF) to assimilate LAI into crop model. Meteorological data, agro-meteorological data and MODIS LAI data were used to test the applicability of PyWOFOST model in simulating maize yield in Northeast China.	2012
Xiaoyun	Studies the application of Kalman filter in agricultural economic forecasting. At first it introduces the multivariate Bayesian dynamic linear model with the Kalman filter, then gives some knowledge about subjective intervention.	1996
J. Koo	Development The DSSAT-CENTURY model and the ensemble Kalman filtering method to estimate soil carbon, crop biomass, and a model parameter and specifies the rate of soil organic matter decomposition	2007
Jawoo Koo,	Used The DSSAT-CENTURY model and the Ensemble Kalman Filtering (EnKF) method to test if this approach can reduce the soil carbon measurement error. A base case simulation study was setup with maize farming system in Ghana for 50 years.	2003
Fang-ming Zhang,	Developed A real-time positioning system, which consists of a NIR camera, a turning angle sensor, and two encoders, for field vehicle applications. A position-attitude (PA) model was designed and extended Kalman filter was used to integrate the signals from these sensors to output accurate position estimation.	2006
De Wit	Used an Ensemble Kalman filter (EnKF) to assimilate coarse resolution satellite microwave sensor derived soil moisture estimates (SWI) for correcting errors in the water balance of the world food studies (WOFOST) crop model. Crop model simulations with the EnKF for winter wheat and grain maize were carried out for Spain, France, Italy and Germany for the period 1992–2000.	2007
Libby	Presents a perception-based GPS free approach for localizing a mobile robot in an orchard environment. An extended Kalman filter (EKF) algorithm is presented that uses a wheel odometry prediction step and laser rangefinder update steps	2011
Park	Develop The aerial application using an unmanned agricultural helicopter has been already utilized in Japan and Korea. an affordable attitude measurement system using a conventional Kalman filter algorithm that would be applied in an affordable agricultural unmanned control system.	2011
Hongyuan	Estimating regional winter wheat yield by assimilation of time series of HJ-1 CCD Normalized Difference Vegetation Index (NDVI) into World Food Studies (WOFOST)–ACRM model with Ensemble Kalman Filter	2013
Hague	Examines ground based (as opposed to satellite based) sensing methods for vehicle position fixing. Sensors are considered in various categories, motion measurement (odometry, inertial), artificial landmarks (laser positioning, millimetre wave radar), and local feature detection (sonar, machine vision). The most common technique, the Kalman filter, is outlined and practical points are discussed.	2000
Luan	Applied classic Kalman filter to estimate the greenhouse states and filter out the noises, where some or all measurements are lost in a random fashion.	2011
Duggal	Described a framework, which performs plantation monitoring, and yield estimation using the supervised learning approach, while autonomously navigating through an inter-row path of the plantation. The proposed navigation framework assists the quadcopter. The proposed framework utilizes fusion of data from IMU and visual SLAM with extended Kalman filter (EKF) to address the limitations of systems using only GPS or IMU	2016
Mourik	Explored model based filtering. The focus was on estimating the average climate inside a greenhouse compartment. Starting point was employing an extended Kalman filter (EKF), combined with a greenhouse climate differential equation model.	2019

Citation: Negrete JC. A Kalman Filter Uses in Mexican Agriculture. Arch Agri Res Technol. 2020; 1(1): 1003.



Zhang	Describes a numerical robust and computational efficient square-root central difference Kalman filter (SRCDKF) and put it into the application of state estimation of Inertial Navigation System (INS)/GPS integrated navigation for wheeled agricultural robot to overcome the flaws exist in EKF (Extended Kalman Filter).	2008
Penizzotto,	proposes a fusion of states obtained from two sensors, odometer and GPS, each one working with its respective sampling time, which may or may not coincide with the sampling time of the controller system. An Extended Kalman structure, based on the kinematic model of the uni-cycle type robot, is used to filter and prepare the signals before being merged.	2008
Sorensen	Modeled the continuous time dynamics of (log \square) commodity prices as a sum of a deterministic seasonal component, a non \square stationary state \square variable, and a stationary state \square variable. Futures prices are established by standard noarbitrage arguments and the Kalman filter methodology is used to estimate the model parameters for corn futures, soybean futures, and wheat futures based on weekly data from the Chicago Board of Trade for the period 1972–1997.	2002
Hansen	Describes the use of derivative free filters for mobile robot localization and navigation in an orchard. The localization algorithm fuses odometry and gyro measurements with line features representing the surrounding fruit trees of the orchard	2011
Bolten	Attempt to correct for the errors by designing and applying an Ensemble Kalman filter (EnKF) data assimilation system to integrate surface soil moisture retrievals from the NASA Advanced Microwave Scanning Radiometer (AMSR-E) into the USDA modified Palmer soil moisture model	2010
Zhang	Adopted An electric bicycle as experimental platform and system performance with two positioning methods of automatic navigation respectively and was analyzed, the one was GPS positioning method and the other was the method based on a fusion of two data source(RTD DGPS and digital compass)by Kalman filter.	2009
Ying	Studied a new navigation method to improve the position accuracy. The compensate model is built to compensate for the libration caused by the antenna. A Kalman filter is developed, and a VRS-based receiver is used as the low accuracy GPS. The Kalman filter is applied to the data collected from the low accuracy GPS, compass and speed sensor.	2009
Huanyu	Built A platform up to collect the pressure data near the nozzle.The instantaneous flow data was calculated based on the relationship between pressure and flow by using Kalman filtering algorithm.	2014
Dorvigny	Present a navigation solution based on the Kalman Extended Filter. The inertial sensor measurements of the Low cost with GPS measurements to estimate the estimation of the position and speed of an autonomous vehicle	2018
Marchant	Establish the accuracy of an autonomous vehicle working in a field of transplanted cauliflowers. The main sensing systems, odometry and image analysis, are briefly described as is the control system which is based on a fusion of the two data sources using a Kalman filter.	1997
Gomez	Study to reduce the quantization errors of some low-cost GPS receivers by using a Kalman filter. Kinematic tractor model equations were employed to particularize the filter, which was tuned by applying Monte Carlo techniques to eighteen straight trajectories, to select the covariance matrices that produced the lowest Root Mean Square Error in these trajectories.	2013
Hamouda	Introduced Smart heterogeneous precision agriculture (SHPA) using a wireless sensor network for limited energy sensor nodes, deployed in an agricultural farm which is divided into a number of heterogeneous agricultural areas. At each time step, the extended Kalman filter is adopted measure and to predict the agricultural parameters including the soil moisture and temperature so that the noise associated with noisy measurements is filtered.	2019
Jun Li	Implemented the application of electric agricultural machinery, the SOC estimation of Ni-MH power batteries by the Square-Root Central Difference Kalman Filter (CDKF) approach in this paper.	2011
Esposti	Applied a Kalman filter In order to identify real long-run technological change, to a stochastic process depicting the generation of technical change induced by R&D and Extension expenditure. The empirical evidence reveals that short-term shocks greatly affect the traditional measure of productivity.	2000
Bolivar	Design, implementation and validation of two high-precision geolocation algorithms for a land vehicle from the University of Ibagué, to be used inprecision agriculture, which integrate a Kalman filter Assembled with an Adaptive Kalman filter and a conventional Kalman filter	2018
Rodríguez	Described three different implementations of the Kalman filter, using different sensor combinations but based on the same vehicle model. The alternative solution presented is to combine the data provided by different positioning sensors using a Kalman filter. The described procedure also uses an odometric estimation of the mobile position, based on the kinematic model of the agricultural vehicle	2009
Zhang	Developed an automatic guidance system on KUBOTA SPU-68 rice transplanter using Trimble 5700 RTK-DGPS and Crossbow AH RS500GA-227.RTKDGPS positioning data was corrected using the heading,roll and pitch parameters acquired from AHR500GA.A Kalman filter based on position-velocity model was developed to smooth the corrected DGPS positioning data and evaluate the bias error of the heading angle.	2009
Gomez	Analyze the cyclical interdependence of GDPof the province of Cauca with its neighbors Nariño, Huila, Valle and Tolima Under the methodology of the Filter of Kalman and Hodrick-Prescott	2011
F. Zhang	Constructed a position-velocity (PV) model and a multi-sensor system, consisted of a consumer application GPS, a MEMS gyro, two encoders, and a turning angle sensor, for the positioning system. Was used the Kalman filter and this improves the positioning system.	2012
Lopez-Cruz	Investigated a data assimilation approach using two non-linear Kalman filters in light of prediction uncertainty. An extended EKF) and an unscented (UKF) Kalman filters were designed to estimate climate states, and also both the states and model parameters.	2015



it. Later the filter is implemented and finally the performance of the filter is measured by means of the integral of the quadratic error, in which the difference of the real states minus the states estimated by the filter is taken. Gonzalez [18]. Proposed the implementation of the Discrete Kalman Filter (DKF) algorithm together with an autoregressive model with exogenous input (ARX) to perform the forecast of short-term flows 24, 48, 72 and 96 hours in advance in the Turbio river basin, located in the state of Guanajuato and part of the state of Jalisco, Mexico, vulnerable to flooding during the periods of rain that normally occur in the area. Castillo [19] made the forecast of the drought indices SPI (Standard Precipitation Index) and SPEI (Standard Precipitation Evapotranspiration Index) for 14 meteorological stations of the Fuerte river basin in Northwest Mexico. The hypothesis was that such a goal can be achieved by implementing the Discrete Kalman Filter (DKF) algorithm. Morales [20] evaluates the utility and applicability of the discrete Kalman filter algorithm in predicting short-term flows [21-40]. The algorithm is applied to the basin of the Ángel Albino Corzo dam (Peñitas), part of the Grijalva Hydroelectric System, and to the Sayula hydrometric station [41-50].

Discussion and Conclusion

From the reviews carried out in articles from other countries, the use of this method in navigation systems is notoriously important. In Mexico, as this field is incipient, the application of the Kalman filter is also used for other types of research such as irrigation, agricultural economics, agrometeorology and models of crop growth as researchers focus on more current topics such as aerial and land unmanned agricultural vehicles the use of this important tool will also be greatly increased due to its benefits and applications in navigation [51-60].

References

- Negrete JC (2016) Automation of greenhouses in Mexico, current status and perspectives. *Advance Research in Agriculture and Veterinary Science* 3(2).
- Negrete JC (2018c) Internet of things in Mexican agriculture; a technology to increase agricultural productivity and reduce rural poverty. *Research and Analysis Journal* 1(2): 40-52.
- Negrete JC (2015) Mechatronics in Mexican Agriculture current Status and Perspectives. *SSRG International Journal of Agriculture & Environmental Science (SSRGIAES)* 2(3).
- Negrete JC (2018a) Artificial Vision in Mexican Agriculture, a new technology for increase food security. *Management and Economic Journal* 2(8).
- Negrete JC (2018b) Artificial Vision in Mexican Agriculture for Identification of diseases, pests and invasive plants. *J Advan Plant Sci* 1: 303.
- Negrete JC (2019) Autonomous Guidance in Agricultural Machines for Mexican Agriculture; A Technology to Increase Agricultural Productivity. *EC Agriculture* 5(12).
- Kalman RE (1960) New Approach to Linear Filtering and Prediction Problems. *Transactions of the ASME. Journal of Basic Engineering* 82(1): 35-45.
- Ruíz GA, López CIL, Ramírez AA, Rico GE (2014) Modeling uncertainty of greenhouse crop lettuce growth model using kalman filtering. *ActaHortic* 1037: 361-368.
- Sánchez HG, Ferreira HJ, Alvarez W, González TJ, Herrera ZG (2017) Optimization of groundwater level monitoring for a fixed frequency. *Water science and technology* 8(5): 19-38.
- Begovich MO, Víctor M, Ruiz C, Juan CZ (2004) Real-time implementation of an LQG control in a prototype of an open irrigation channel for several sections. *Hydraulic Engineering in Mexico* 19(2): 5-15.
- Loría E, Ramos MG (2007) Okun's Law: A Rereading for Mexico, 1970-2004 *Economic Studies. The College of Mexico, A.C. Federal District, Mexico* 22(1): 19-55.
- Serrano PF (2015) Application of systems identification methods to the growth model of a lettuce. B.Sc. Thesis IPN Mexico.
- Ruiz VM, Begovich O, Mendes E, Lefevre L, Georges D, et al. (2004) Optimal control downstream of a laboratory channel. 2nd International Congress on Innovation and Technological Development, Cuernavaca, Morelos, Mexico, p. 15-19.
- Ortiz SS (2019) Location and robust simultaneous mapping applied to the planning of trajectories in mobile robots. Ph.D. Thesis. CINVESTAV. IPN. Mexico.
- INECC (2018) Economic modeling of the Agriculture, Forestry and Other Land Uses sector (AFOLU) for the baseline estimation of greenhouse gas emissions and short-lived climate compounds. National Institute of Ecology and Climate Change, Mexico.
- Pérez IR (2013) Discreet Kalman filter to determine an alert against extreme hydrometeorological phenomena before climatic variability. *Mexican Meteorological Congress*.
- Gutiérrez SM, Muñoz CJJ, Hernández GLH (2017) Estimation of the orientation of a quadcopter through the implementation of an EKF. *The Mechatronics in Mexico* 6(2): 46-53.
- Gonzalez LF (2015) Discrete Kalman Filter flow forecast in the Turbio river. *Tecnol science water* 6(4): 5-24.
- Castillo CM (2018) Forecast of discrete Kalman filter droughts in the Fuerte river basin, Mexico. *Agrociencia* 52(7).
- Morales V, Aparicio MIJ, Valdes JB (2014) Avenue forecast using the discrete Kalman filter. *Technology and Water Sciences* 5(2): 85-110.
- Anadranistikisa M, Kostas L, Vassiliki K, Helias E (2004) Correcting temperature and humidity forecasts using Kalman filtering: potential for agricultural protection in Northern Greece. *Atmospheric Research* 71: 115-125.
- Bolívar MF (2018) Design, Implementation and Validation of a High Precision Geolocation Algorithm for a rover-type land navigation vehicle of the University of Ibagué M.Sc. These University of Ibagué Colombia.
- Bolten JD, Wade TC, Xiwu Z, Jackson TJ, Fellow CA, et al. (2010) Evaluating the Utility of Remotely Sensed Soil Moisture Retrievals for Operational Agricultural Drought Monitoring. *IEEE Journal of selected topics in applied earth observations and remote sensing* 3(1).
- Carsten S (2002) Modeling seasonality in agricultural commodity futures. *Journal of Futures Markets* 22(5): 393-426.
- Chen S, Zhao Y, Shen SH (2012) Applicability of PyWOFOST Model Based on Ensemble Kalman Filter in Simulating Maize Yield in Northeast China. *Chinese Journal of Agrometeorology*.
- De Wit AJW, Van Diepen CA (2007) Crop model data assimilation with the Ensemble Kalman filter for improving regional crop yield forecasts. *Agricultural and Forest Meteorology* 146(1-2): 38-56.
- Duggal V, Sukhwani M, Bipin K, Reddy GS, Krishna KM (2016) Plantation monitoring and yield estimation using autonomous quadcopter for precision agriculture. *IEEE International Conference on Robotics and Automation (ICRA)*, Stockholm, pp. 5121-5127.
- Dorvigny DD, Hernández SL, Delvis GGD (2018) Integrated navigation algorithm for autonomous vehicles with low cost technology. *Revista Cubana de Ciencias Informáticas* 12(3).
- Esposti R (2000) Stochastic Technical Change and Procyclical TFP The Case of Italian Agriculture. *Journal of Productivity Analysis* 14: 119-141.
- Fang MZ, Yi BY, Qin Z, Beom SS (2006) Vision-based Position System for Agricultural Vehicle Using Extended Kalman Filter. Paper number 061157, ASAE Annual Meeting.
- Freitas G, Ji Z, Bradley H (2012) A Low-Cost, Practical Localization System for Agricultural Vehicles Intelligent. *Robotics and Applications*, 7508.
- Gomez SAM (2011) Analysis of the interdependence of the business cycles of Cauca and southwestern Colombia, an econometric approach from the alman and Hodrick-Prescott filters. *General Study* 27(121): 115-141.
- Gomez GJ, Ruiz GR, Alonso GS, Gomez GFJ (2013) A Kalman Filter Implementation for Precision Improvement in Low-Cost GPS Positioning of Tractors Sensors *13(11): 15307-15323*.
- Hamouda YEM, Msallam MM (2019) Smart heterogeneous precision agriculture using wireless sensor network based on extended Kalman filter. *Neural Comput&Applic* 31: 5653-5669.



35. Hongyuan M , Jianxi H, Dehai Z, Junming L, Wei S, et al. (2013) Fan Estimating regional winter wheat yield by assimilation of time series of HJ-1 CCD NDVI into WOFOST-ACRM model with Ensemble Kalman Filter. *Mathematical and Computer Modelling* 58(3-4): 759-770.
36. Hague T, Marchant JA, Tillett ND (2000) Ground based sensing systems for autonomous agricultural vehicles *Computers and Electronics in Agriculture* 25(1-2): 11-28.
37. Hansen S, Bayramoglu E, Andersen JC, Ole R, Nils AA, et al. (2011) Orchard navigation using derivative free Kalman filtering. *Proceedings of the 2011 American Control Conference, San Francisco, CA*, pp. 4679-4684.
38. Ji Y, Liu Z, Liu G, Zhan M, Zhou J (2009) Positions Research of Vehicle Navigation System Based on Kalman Filter *Transactions of the Chinese Society for Agricultural Machinery*.
39. Jiang H, Zhou M, Tong J, Liu Y (2014) PWM Variable Spray Control Based on Kalman Filter. *Transactions of the Chinese Society for Agricultural Machinery*.
40. Jun L, Huazhong L, Zhou Y, Feng P (2011) State-of-charge estimation and charge equalization for electric agricultural machinery using Square-Root Central Difference Kalman Filter. *Proceedings 2011 International Conference on Transportation, Mechanical, and Electrical Engineering (TMEE), Changchun*, pp. 966-969.
41. Koo J, Bostick WM, Naab JB, Jones JW, Graham WD, et al. (2007) Estimating Soil Carbon in Agricultural Systems Using Ensemble Kalman Filter and DSSAT-CENTURY. *Transactions of the ASABE*, 50(5): 1851-1865.
42. Koo J, McNair BW, James WJ, Arjan JG, Jesse BN (2003) Estimating Soil Carbon in Agricultural Systems using Ensemble Kalman Filter and DSSAT-CENTURY. Paper number 033041, ASAE Annual Meeting.
43. Laia MA, Cruvinel PE (2008) Applying an Improved Square Root Unscented Kalman Filtering in Tomographic Projections of Agricultural Soil Samples. Rio Grande, Brazil: University of São Paulo 18(1): 17-31.
44. López CIL, Peter Van B, Van MS, Van HEJ (2017) Performance of extended and unscented Kalman filters for state and parameter estimation of a greenhouse climate model. June 2017 *Acta horticulture*.
45. Liu X, Zhang X, Xin X (1996) Application of Kalman filter in agricultural economic forecasting. *IEEE International Conference on Systems, Man and Cybernetics. Information Intelligence and Systems*.
46. Libby J, Kantor G (2011) Deployment of a point and line feature localization system for an outdoor agricultural vehicle. *IEEE International Conference on Robotics and Automation (ICRA), Shanghai, China*, pp. 1565-1570.
47. Marchant JA, Hague T, Tillett ND (1997) Row-following accuracy of an autonomous vision-guided agricultural vehicle. *Computers and Electronics in Agriculture* 16(2): 165-175.
48. Ming L, Kenji I, Katsuhiro W, Shinya Y (2009) Review of research on agricultural vehicle autonomous guidance. *Int J Agric&BiolEng* 2(31).
49. Mourik SV, Peter JM, Van B, Irineo LLC, Eldert JVH (2019) Improving climate monitoring in greenhouse cultivation via model based filtering. *Biosystems Engineering* 181: 40-51.
50. Oksanen T, Markus L, Arto V (2005) Low-cost positioning system for agricultural vehicles *Proceedings. IEEE International Symposium on Computational Intelligence in Robotics and Automation June Espoo, Finland*, p. 27-30.
51. Park HJ, Koo YM, Park HB (2011) Determination of flight attitude using kalman filter for an agricultural unmanned helicopter. *2nd International Conference on Instrumentation Control and Automation, Bandung*, pp. 146-151.
52. Penizzotto F, Alvarez O, Patino D, Carelli R (2008) Control system based on a fusion of GPS and odometry for the autonomous navigation of vehicles in vineyard, fruit plantations and open fields. *37th JAIIO - Conference of IndInfAgroinformatics (JII 2008 Agroinfo)*, pp. 100-114.
53. Rodríguez M, Gómez J (2009) Analysis of Three Different Kalman Filter Implementations for Agricultural Vehicle Positioning. *The Open Agriculture Journal* 3: 13-19.
54. Wu D, Zhang Q, Reid JF (2001) Adaptive steering controller using a Kalman estimator for wheel-type agricultural tractors. *Robotica* 19(5): 527-533.
55. Xiaoli L, Yan S, Fei L (2012) Unscented Kalman Filtering for Greenhouse Climate Control Systems With Missing Measurement. *International Journal of Innovative Computing, Information and Control* 8(3): 2173-2180.
56. Yuliang Z, Feng G, Lei T (2008) INS/GPS integrated navigation for wheeled agricultural robot based on sigma-point Kalman Filter. *Asia Simulation Conference - 7th International Conference on System Simulation and Scientific Computing, Beijing*, pp. 1425-1431.
57. Zhang M, Zhou J, Ji Y (2009) Positioning method for automatic navigation of agricultural vehicle. *Transactions of the CSEA* 25(2): 74-77.
58. Zhang Y, Gao L, Tian L (2008) INS/GPS integrated navigation for wheeled agricultural robot based on sigma-point Kalman Filter. *Asia Simulation Conference - 7th Intl. Conf. on Sys. Simulation and Scientific Computing*, p. 1425-1431.
59. Zhang F, Feng X, Li Y (2012) A Low-Cost Positioning System for Parallel Tracking Applications of Agricultural Vehicles by Using Kalman Filter. *IFIP Advances in Information and Communication Technology. Computer and Computing Technologies in Agriculture* 5: 461-470.
60. Zhang Z, Luo X, Zhao Z, Huang P (2009) Trajectory Tracking Control Method Based on Kalman Filter and Pure Pursuit Model for Agricultural Vehicle. *Proceedings of the Joint International Agricultural Conference .Transactions of the Chinese Society for Agricultural Machinery. China*.