

Implementing Doppler Radar Using ADAS

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1. Abstract

This document examines the role of Doppler Radar technology in Advanced Driver Assistance Systems (ADAS) and highlights its significance in enhancing vehicle safety and enabling autonomous functions, marking a crucial advancement towards safer, more self-reliant vehicles. By exploring the basic concepts of Doppler Radar and its applications in detecting objects, measuring speed, and preventing collisions, we demonstrate how radar contributes to better situational awareness in ever-changing traffic scenarios. This paper delves into key aspects of Doppler Radar, the architectural framework of the system, signal processing methods, and the collaborative benefits achieved through its integration with various other sensing technologies via sensor fusion. It also addresses current challenges such as resolution, environmental factors, and regulatory issues, concluding with perspectives on future developments in high-resolution imaging radar and sensor networks powered by artificial intelligence for autonomous driving.

2. Keywords

Doppler radar, Advanced Driver Assistance Systems (ADAS), autonomous vehicles, Doppler effect, radar signal processing, adaptive cruise control (ACC), forward collision warning (FCW), automatic emergency braking (AEB), blind spot detection, rear cross traffic alert, traffic sign recognition, radar frequency bands, LiDAR, camera-based detection, environmental interference, multipath reflection, angular resolution, 4D imaging radar, electronic control unit (ECU), spectrum management.

3. Introduction

Vehicles face numerous challenges on the roads while driving, which can be categorized into environmental, human, technical, and infrastructural issues. These problems can lead to accidents, traffic congestion, and inefficient transportation. Accidents are the most unwanted thing that should happen to the highway and in general road users. These accidents could be from very minor to the most fatal ones and the majority of these deadly accidents happen as a result of speeding. Vehicles with comparatively slower speeds are at a lower risk of facing accidents than those with faster speeds. To enhance vehicle safety and automation Doppler radar is used in Advanced Driver Assistance Systems (ADAS) by providing real-time velocity and motion data. ADAS endeavors to minimize human error in driving using sensors and automation. From all the different sensing technologies, Doppler radar is key in strengthening the detection and tracking capabilities of contemporary vehicles. A crucial component in adaptive vehicle-activated sign systems is the precise measurement of a vehicle's speed. Doppler radar is a type of radar that leverages the Doppler effect, which detects frequency changes in transmitted radio waves when they bounce off moving objects. This makes it possible to accurately determine an objects velocity, direction, and movement parameters.

The use of Doppler radar in ADAS is mainly focused on real-time object detection and motion analysis. Since the output of the sensor is a sinusoidal wave with a very small amplitude, it requires amplification through an amplifier before further processing. The ESP32 is used as a microcontroller where all the calculations take place and the speed is also displayed using this microcontroller.

In contrast with conventional radar systems that mainly provide distance measurements, Doppler radar offers vital velocity information, thus being crucial in applications like Adaptive Cruise Control (ACC), collision avoidance, and pedestrian detection. It is one of its major strengths to be able to function effectively across different environment situations, such as fog, rain, and darkness, where cameras and Light Detection and Ranging optical sensors may not work.

Also combining Doppler radar with sensor fusion algorithms greatly boosts ADAS functionality by mitigating the weakness of standalone sensors. Integration of Doppler radar within current ADAS frameworks is indispensable for the progression of smart transport systems and advancements towards autonomous vehicles.

4. Literature Review

The use of Doppler radar in ADAS has been extensively researched over the past few years. Different research studies have concentrated on its efficiency in enhancing vehicle safety and automation. Studies have proven the superiority of Doppler radar over conventional sensors, especially during bad weather. In particular, the review will constitute a table summary of highlights from approximately 25 research papers that are further categorized by methodology, technologies and application areas. The summary table will also provide an overview of the gaps in the literature review identified for which this research efforts to address. Crucially, we will touch on aspects such as motion and real-time change in speed, and how different technologies are used for calculating this motion analysis and speed calculation of the vehicle, also cost effectiveness of Arduino and ESP32 and performance will be assessed. The implementation process for building the prototype model of the Doppler radar in ADAS where ESP32 is used as a microcontroller will be explored.

4.1. A Review on Radar-Based Human Detection Techniques

Research on radar-based human identification techniques commenced after 2005. Lai was among the initial studies focused on human identification utilizing radar. Following this, multiple studies were carried out regarding the viability of this endeavor. These studies address the viability of human-animal distinction, the analysis of human gait, and the examination of behaviour. Micro-Doppler radars are used in these areas because of their advantages over cameras and other types of sensors, such as their penetration capabilities, which make them advantageous for use in obscured environments. This allows them to be used through walls, smoke, fog, and so on. Radar can be used in all weather conditions. This gives them advantages over cameras in foggy environments and in the rain for their use in surveillance applications and automobile industry applications. Radars also allow for surveillance without the invasion of the privacy of the targets. This makes them better candidates for elderly care.

4.2. Using millimetre-wave radar to evaluate the performance of ADAS

Taking into account the significant expense ADAS and dangerous conditions, simulation testing using a dummy model is emerging as a viable method for practicing ADAS road tests to decrease the costs of experimentation.

Millimetre-wave radar is generally considered an emerging technology for collecting traffic data in the Intelligent Transportation System nowadays³⁰⁻³¹. It works within the frequency from 30 GHz (lower than visible light and infrared) to 300 GHz (higher than the radio) and has the advantages of both microwave guidance and photoelectric guidance. The working principle of this kind of radar is to generate the signal whose frequency increases gradually with time through the oscillator and measure the distance from the obstacle to the object according to the frequency difference between the returned waveform and the transmitted waveform. The millimetre-wave radar transmits the modulated electromagnetic wave signal through the transmitting antenna while the sensor receives the reflected electromagnetic wave signal at the antenna end. After the radio frequency front-end circuit processing, the radar system will carry out the relevant signal processing on the reflected signal of the target, and then parameters such as the distance, velocity and azimuth of the target can be calculated.

4.3. Analysis of ADAS Radars with Electronic Warfare Perspective

Doppler radar complements ADAS by offering accurate real-time information about the speed and direction of objects around. Although this technology greatly enhances the safety and efficiency of driving, it also provides weaknesses that may be targeted in electronic warfare contexts. Malicious users might hijack radar waves, jamming frequencies, or use spoofing attacks to trick ADAS-equipped vehicles, potentially causing traffic disturbances or security breaches.

4.4. Technologies used for Speed Calculation and Motion Analysis apart from Doppler radar

Besides Doppler radar, there are a number of other technologies employed for speed calculation and motion analysis in ADAS and other automotive applications.

1) **LiDAR (Light Detection and Ranging)**

Emits laser pulses to determine distances and build 3D models of the environment. Measures motion by comparing the time difference between transmitted and received signals. Very accurate but may be costly and weather-sensitive.

2) **Computer Vision (Camera-Based Analysis)**

Uses machine learning and optical flow computations to identify and track object movement. Stereo cameras calculate depth, enabling speed and movement estimation. It performs well in well-structured environment but may have issues in poor lighting or harsh weather conditions.

3) **Inertial Measurement Units (IMU)**

Made up of accelerometers and gyroscopes to determine acceleration, velocity, and angular motion. Used in conjunction with GPS in many applications for motion tracking. Prone to drift errors over a period without external corrections.

4) **GPS-Based Speed Measurement**

Utilizes satellite signals to calculate the speed and movement of the vehicle. Precise when used in open spaces but may be less accurate while driving through tunnels or cities where signals can be blocked.

5) **Ultrasonic Sensors**

Send out sound waves and calculate how long it takes for the echo to travel back to them, calculating object distance and movement. Good for detecting short-distance motion, such as parking aid. Poor range and lower precision for high-speed motion detection.

6) **Time-of-Flight (ToF) Sensors**

Take the time for emitted light to reflect off an object. Applied in depth sensing and short-range motion measurement. Works efficiently at low speeds but less so at high speeds.

7) **Millimetre-Wave Radar**

Functions on 24 GHz, 60 GHz, or 77 GHz frequency bands. Measures accurate speed and distance like Doppler radar. Is less influenced by weather conditions than LiDAR or cameras.

4.5. Impact Analysis of Advanced Driver Assistance Systems (ADAS) regarding Road Safety- Computing Reduction Potentials

A software tool was created to assess the crash reduction potential of the chosen ADAS for the future years 2030, 2040. The findings reveal that the ADAS related to warning/braking possess the highest potential for future crash reduction and could result in a decrease of up to 8,700 crashes and 70 fatalities in Austria by 2040.

Furthermore, the Intelligent Speed Assistance system is projected to achieve an overall crash reduction of 8% in comparison to current crash statistics in Austria by 2040. The Turning Assistant for heavy goods vehicles demonstrates the smallest decrease in crashes and injuries; however, due to the highest severity per incident (93 fatalities per 1,000 crashes), it still plays a significant role in reducing fatalities on the roads.

Nonetheless, to realize the safety benefits of ADAS, it is extremely important that these systems are utilized correctly. In the future, it will be essential to provide users with increased information regarding the appropriate use, advantages, and limitations of each ADAS and to incorporate the use of these systems into driver training protocols and examinations.

For the USA, calculated the number of accidents, injuries, and deaths that could be prevented with the use of the ADAS technologies Forward Collision Warning (FCW), Automatic Emergency Braking (AEB), Lane Departure Warning (LDW), Lane Keeping Assistance (LKA) or Blind Spot Warning (BSW). The findings were estimates of crashes, injuries, and fatalities that could potentially be avoided or severity-reduced, based on the crash statistics in the USA for 2016, under the assumption that the vehicles involved were fitted with the relevant ADAS.

4.6. Literature Review Highlights and Research Gaps Existing literature: Implementation of Doppler radar in ADAS has several strengths and limitations. A survey of the literature indicates that Doppler radar has been extensively studied

concerning ADAS, achieving significant advancements in signal processing algorithms and sensor fusion methods. Researchers have explored various radar configurations, including monostatic and multistatic radar systems, to improve target detection and classification accuracy. Additionally, Studies have highlighted the implementation of high-frequency(77GHz) radar to boost resolution and reduce interference.

Despite these advancements, several research gaps remain:

- i.Limited Object Classification Capability:** Doppler radar alone struggles to differentiate between various objects, necessitating improved machine learning algorithms for classification.
- ii.Interference Management:** The growing use of radar sensors in vehicles has led to signal interference issues, requiring enhanced signal processing techniques.
- iii.Sensor Fusion Optimization:** While multi-sensor fusion (such as radar combined with LiDAR and cameras) has shown potential, optimal integration strategies for enhanced perception are still an ongoing research focus.
- iv.Real-Time Processing Challenges:** The high computational demands of processing high-resolution radar data pose a challenge to real-time implementation in ADAS.

5. Doppler Radar Fundamentals

5.1. Principles of Doppler Effect

Doppler Radar operates by transmitting a microwave signal and receiving its reflection from moving objects. The frequency shift between transmitted and received signals- the Doppler shift indicates the relative velocity of the object. The principle of Doppler radar is based on the Doppler effect where frequency of wave changes based on the relative motion between the wave source and the observer. In the context of automotive applications, a Doppler radar system transmits a continuous or pulsed microwave signal towards a target. When this signal reflects off a moving object, such as another vehicle, the frequency of the reflected signal shifts in proportion to the object's relative velocity.

The radar receiver measures this frequency shift and uses it to calculate the speed and direction of the target object. The formula for this shift is:

$$\Delta f = (2 * v * f_0) / c$$

Where:

- Δf is the observed frequency shift
- v is the relative velocity between the radar and the target
- f_0 is the transmitted frequency
- c is the speed of light

This ability to measure relative velocity makes Doppler radar extremely valuable for real-time motion detection, enabling features like adaptive cruise control and collision avoidance

5.2. Radar Frequency Bands in Automotive

- **24 GHz:** Cost-effective, short-range
- **77 GHz:** Higher resolution, longer range, better object discrimination

6. System Architecture and Signal Processing

6.1. Radar Hardware Components

A radar system's hardware components include a transmitter, antenna, receiver, duplexer, and a display system. These components work together to send out electromagnetic signals, receive reflected signals, and present the data in a usable format. RADAR, the acronym for Radio Detection and Ranging System, is an electromagnetic sensor that is used for detection, tracking, locating, and identifying various objects at considerable distances. It functions by emitting electromagnetic energy towards objects, often called targets, and then analyzing the energy that is reflected from them. A typical automotive Doppler radar system consists of the following key components:

- **Transmitter Module:** Generates and emits a microwave signal, typically using a frequency-modulated continuous wave (FMCW) scheme for simultaneous range and velocity measurement. This can take form of power amplifier, such as a Klystron, or a power oscillator like a Magnetron.
- **Antenna Array:** Directs the outgoing radar waves and receives the reflected signals. Multiple antennas can be used to perform angle estimation using beamforming or MIMO (Multiple Input Multiple Output) configurations. It transmits pulses of radio waves. The antenna employed may be a parabolic reflector, planar array, or electronically steered phased array.
- **Receiver Module:** This can be a superheterodyne receiver, or another type containing a processor to analyze and detect the signal. Captures the reflected signals, converts them into baseband, and filters out noise for signal clarity.
- **Signal Processor Unit:** Performs real-time computation of range, velocity, and angle using advanced algorithms including Fast Fourier Transform (FFT) and Constant False Alarm Rate (CFAR) detection. It is an accelerator for radar signal processing functions. It is capable of processing radar data autonomously, performing several operations on 3D data in a single configuration without intervention. Data is streamed through the SPU using two pairs of buffer memory.
- **ECU Interface:** ECU interface provide a direct connection to an OEM ECU microcontroller via memory emulator, DAP or Aurora debugger interface. Modern vehicles typically have more than 1000 electronic control units (ECUs), connected via various in-vehicle networks such as CAN, FlexRay, LIN, and Ethernet. These buses are used to exchange information and coordinate control. It can be also said like the processed radar data is transmitted to the vehicle's electronic control unit, where decision-making algorithms translate it into actionable insights such as collision warnings or automatic braking commands.

This architecture allows the radar system to efficiently handle a continuous stream of data, ensuring real-time responsiveness for critical ADAS functionalities.

6.2. Signal Processing Techniques

Signal processing techniques involve the manipulation and analysis of signals to extract meaningful information or improve their quality. These techniques are used in various fields like telecommunications, audio and video processing, image processing, and speech recognition. Common tasks include filtering, noise reduction, compression, and feature extraction. Doppler radar systems rely on a series of advanced signal processing techniques to convert raw reflected signals into actionable object detection data:

- **Fast Fourier Transform (FFT):** Converts time-domain signals into the frequency domain, enabling precise determination of the targets distance and relative speed.
- **Constant False Alarm Rate (CFAR):** A detection algorithm that dynamically adjusts the threshold for signal detection based on the surrounding noise level, reducing false positives in various environments.
- **Beamforming:** Uses multiple antenna inputs to shape and direct the radar beam, improving angular resolution and target tracking.
- **Doppler Processing:** Calculates relative speed by analyzing the Doppler shift in the received signal, allowing differentiation between stationary and moving objects.
- **Tracking Filters (Kalman Filter):** Smooths and predicts the future position of detected objects, providing stability in object tracking and enabling accurate collision prediction.

Through this layered architecture and sophisticated signal processing, Doppler radar systems are capable of delivering reliable, real-time data for complex traffic environments.

7. ADAS Functionalities Enabled by Doppler Radar

Doppler radar plays a vital role in enabling various features of Advanced Driver Assistance Systems (ADAS) by measuring the speed of surrounding objects in relation to a vehicle. Below are the primary ADAS functions that benefit from Doppler radar:

- i. Adaptive Cruise Control (ACC) Purpose: Maintains a set speed while automatically speeding up or slowing down to keep a safe distance from the vehicle ahead.

Doppler Role: Measures the speed and proximity of the leading vehicle to ensure a secure following distance.

ii. Forward Collision Warning (FCW)

Purpose: Notifies the driver about the risk of a frontal crash with another vehicle or object.

Doppler Role: Estimates the speed and distance closing in on the vehicle, helping to predict potential collisions.

iii. Automatic Emergency Braking (AEB)

Purpose: Activates brakes automatically to avoid or lessen the impact of a crash.

Doppler Role: Provides immediate speed difference data to evaluate threats of imminent collisions.

iv. Blind Spot Detection (BSD)

Purpose: Alerts drivers to vehicles that are located in their blind spots.

Doppler Role: Detects fast-moving objects in adjacent lanes.

v. Rear Cross-Traffic Alert (RCTA)

Purpose: Alerts the driver to approaching traffic when backing up.

Doppler Role: Recognizes the movement and direction of vehicles approaching from behind.

vi. Lane Change Assist (LCA)

Purpose: Warns or prevents unsafe lane-changing actions.

Doppler Role: Observes the velocity of cars in nearby lanes to assess the safety of changing lanes.

vii. Traffic Jam Assist

Purpose: Aids in acceleration, braking, and steering during congested traffic situations.

Doppler Role: Ensures safe spacing at low speeds by monitoring how nearby vehicles are moving.

viii. Collision Avoidance Systems

Purpose: Actively helps to avoid or lessen collisions with other vehicles, pedestrians, or cyclists.

Doppler Role: Detects moving obstacles and calculates their speed and trajectory.

ix. Pedestrian and Cyclist Detection (with Fusion)

Purpose: Warns about vulnerable road users.

Doppler Role: Works alongside visual sensors to determine movement patterns and potential dangers.

Doppler radar is highly valued in ADAS for its reliability across all types of weather and lighting conditions, unlike cameras or lidar, which can be adversely affected by fog, rain, or darkness.

8. Advantages of Doppler Radar over Other Sensing Technologies

Doppler radar offers several advantages over other sensing technologies, particularly in weather forecasting and motion detection. It can "see" wind and measure its speed, even inside storms, a capability not shared by visible or infrared cameras or lidars. This allows for better tornado warnings and a deeper understanding of storm dynamics.

Additionally, Doppler radar is robust in harsh weather conditions and can filter out noise and clutter, making it a valuable tool in various applications. Doppler radar is less affected by weather conditions like rain, fog, or clouds compared to other sensing technologies like lidars or optical systems, according to ScienceDirect.

Doppler radar can effectively filter out signals from weather, terrain, and countermeasures like chaff, reducing computer and operator loading in hostile environments. Doppler radar can detect the relative motion of objects, making it suitable for applications like speed cameras, radar guns, and motion detection in security systems.

Henceforth we can conclude that Doppler radar has applications in various fields, including weather forecasting, military applications, traffic monitoring, and even healthcare (e.g., monitoring heartbeats and respiration).

9. Challenges and Limitations

Radar faces challenges when detecting static objects and pedestrians due to their low radar cross-section (RCS) values [11.]. These objects' relative amount of reflected energy is minimal, reducing their detection capability. Manufacturers like Bosch often define radar ranges based on RCS values for different objects.

Another challenge encountered with radar sensors is the occurrence of ghost targets. Ghost targets can appear when a radar signal reflects from more than one object before being received back at the sensor. A common technique to mitigate this issue is fusing radar information with data from other sensors, such as lidar or cameras, to improve target recognition and tracking.

Radar sensors can suffer from interference by other radar sources, leading to false detections and a reduced signal-to-noise ratio [12.]. To counter this, Noise Radar Technology (NRT) is an effective technique, using non-pseudo-randomly generated noise-based signal waveforms to distinguish incoming signals and improve accuracy. However, complete interference suppression against all external noise sources is only sometimes achievable due to inherent physical limitations.

10. Future Developments and Trends

Doppler radar technology for Advanced Driver Assistance Systems (ADAS) is evolving in several key ways. First, there is a shift to higher frequency ranges (76–81 GHz), improving object detection, especially for small, fast-moving items like pedestrians. Next, radar integration with AI and other sensors enhances scene understanding and object identification. Advanced 4D imaging radar systems offer detailed information on movement, making them suitable for urban areas. Corner radar installation provides 360° coverage, reducing blind spots. Remote software updates allow for post-installation improvements. Increased radar reliability ensures performance in poor weather, while MIMO technology enhances target tracking. Radar-on-chip technology makes units smaller and cheaper. Short-range radar in vehicles monitors occupants' health. Lastly, governments are pushing for safety regulations that include radar systems to boost road safety.

11. Conclusion

Radar systems stand as a testament to the remarkable progress of human ingenuity and innovation. From their inception in the early 20th century to their widespread presence in contemporary society, Radar technology has continuously evolved to meet the everchanging demands of modern life. As we look toward the future, the trajectory of Radar technology appears boundless. With emerging technologies and novel applications on the horizon, Radar systems are poised to further expand their reach and impact across diverse sectors. Doppler radar has proven to be a vital component in the evolution of Advanced Driver Assistance Systems, providing precise and reliable information on object distance and velocity under a wide variety of conditions. Its unique ability to operate effectively in challenging weather and lighting situations makes it indispensable for modern vehicles. Though some limitations exist particularly regarding resolution and susceptibility to multipath reflections ongoing advancements in radar design, signal processing, and AI integration are rapidly overcoming these hurdles. Looking ahead, Doppler radar will continue to play a fundamental role in supporting the transition from driver-assisted systems to fully autonomous vehicles, forming the backbone of a safe and efficient intelligent transportation system.

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