Research on the Application of Multi-Source Radar Signal Fusion Technology in Airborne Target Detection

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Abstract: This study delves into the theoretical foundation, technical architecture design, and practical application effects of multi-source radar signal fusion technology in airborne target detection, aiming to enhance the accuracy, efficiency, and real-time performance of airborne target detection. By comprehensively employing advanced signal processing algorithms, machine learning, and artificial intelligence technology, this study achieves precise identification of subtle features of airborne targets, optimizes the continuity and accuracy of target tracking, and verifies the wide applicability and significant advantages of this technology through various practical application scenarios. The research results indicate that multi-source radar signal fusion technology can effectively overcome the limitations of single radar systems in complex environments, significantly improve the coverage, identification accuracy, and tracking continuity of airborne target detection, and provide an efficient and reliable technical solution for airborne target detection.

Keywords: multi-source radar; signal fusion technology; airborne target detection; precise target identification; efficient target tracking; machine learning; artificial intelligence

1. Introduction

With the development of modernization, airborne target detection technology is facing increasingly higher requirements, and single radar systems are no longer able to meet the detection needs in complex environments. As an emerging solution, multi-source radar signal fusion technology integrates the advantages of different radar systems to provide more accurate and comprehensive detection results. Based on the theoretical foundation of multi-source radar signal fusion technology, this paper explores the key technical architecture of constructing such systems and demonstrates its application effects and strategic value in airborne target detection through practical application scenarios.

2. Theory Foundation of Multi-Source Radar Signal Fusion

2.1 Introduction to Radar System Principles and Signal Fusion Technology

The radar system, a revolutionary electromagnetic wave detection and tracking technology, achieves precise positioning and identification of various targets by emitting electromagnetic waves and capturing the signals reflected back from target objects. Since its inception, radar technology has played an indispensable role in many fields such as military, aviation, and maritime detection. With the continuous advancement of technology and the expanding application areas, traditional single radar systems have gradually become inadequate to meet the increasingly complex detection requirements, especially in combating advanced stealth technology, coping with complex weather conditions, and achieving all-weather, all-round monitoring. Therefore, the application of signal fusion technology has become the key to the development of modern radar systems.^[1]

Signal fusion technology refers to an advanced data processing method that integrates and analyzes information from multiple different sensor sources to obtain more accurate and comprehensive detection results than any single sensor. This method has shown significant advantages in improving target detection accuracy, reducing false alarm rates, and enhancing the ability to identify target characteristics. In complex detection environments, different types of radar systems (such as synthetic aperture radar, moving target indication radar, phased array radar, etc.) can capture target information in

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different dimensions. Signal fusion technology can integrate this information to provide a more comprehensive and accurate target profile. Especially in the detection of low-visibility or stealthy targets, multi-source radar signal fusion technology can significantly improve the performance of detection systems by integrating information from multiple sources, greatly enhancing the efficiency and accuracy of airborne target detection.

The application of signal fusion technology in modern radar systems is not only a reflection of technological progress but also the key to the leapfrog improvement of radar detection capabilities. Through intelligent algorithm processing and efficient data integration, multi-source radar signal fusion brings unprecedented flexibility and powerful adaptability to modern defense, monitoring, and detection systems, enabling them to effectively cope with various complex challenges and ensure the high efficiency and reliability of information acquisition. With the further development of future technology, signal fusion technology will play an even more critical role in intelligent detection and decision support systems, paving the way for the development of radar systems and realizing broader application prospects.^[2]

2.2 Technical Architecture of Multi-Source Radar Systems

Constructing an efficient and powerful multi-source radar system is a major challenge in the modern defense and monitoring domains. This requires not only a profound understanding of various radar technologies but also the organic integration of these technologies at the system design level. Encompassing various radar technologies such as Synthetic Aperture Radar (SAR), Moving Target Indication Radar (MTI), and Phased Array Radar, each has its unique functions and application areas. For example, SAR provides clear imaging capabilities with high resolution in complex terrains, while MTI radar excels in efficiently detecting and tracking dynamic targets. Phased array radar is renowned for its flexibility in multi-target processing and precise target tracking. Therefore, the design of a multi-source radar system must ensure that these different radar technologies can work together to form a complementary and enhanced detection network.^[3]

In the process of designing the technical architecture, the key lies in how to effectively integrate these radar technologies and utilize efficient signal processing algorithms to fuse the collected data. This involves not only the physical integration of hardware, such as antenna layout, signal reception, and configuration of processing units but also the development of algorithms at the software level and data processing strategies. To achieve optimal detection performance, system designers must analyze the characteristics and advantages of various radar technologies in depth and design a system architecture that fully leverages these technological features. Additionally, the development of signal fusion processing algorithms is crucial to enhancing system performance. These algorithms need to be able to process and analyze complex data from different radar sources, extract valuable information, and support more precise and reliable target detection and identification. Through such system design and algorithm optimization, multi-source radar systems can achieve all-round detection of airborne, ground, and maritime targets, significantly improving detection range and accuracy, especially in complex environmental conditions.

2.3 Strategic Value of Signal Fusion

In the modern defense system, the application of signal fusion technology has become a key strategy to enhance the performance of multi-source radar systems, and its strategic value far exceeds technological progress. By integrating and analyzing data from different radar systems, signal fusion not only significantly improves the accuracy and reliability of target detection but also greatly enhances the system's adaptability and identification capability to complex environments and concealed targets. Furthermore, signal fusion technology shows its unique advantage in reducing false alarms caused by environmental factors. Through intelligent data processing, it reduces misjudgments of non-target reflections, thereby improving the efficiency and response speed of the entire detection system.

Furthermore, the strategic value of signal fusion technology is also reflected in its contribution to information sharing and decision support systems. In multi-source radar systems, various types of radars can capture target information from different dimensions. Signal fusion integrates these multi-dimensional data to provide decision-makers with a comprehensive and accurate intelligence picture. During strategic decision-making processes, decision-makers can effectively plan resource deployment and formulate combat strategies based on precise and comprehensive intelligence information, thereby maintaining an advantage in complex and changing environments. Therefore,

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signal fusion technology is not only a tool to improve radar detection capabilities but also a key element to strengthen national defense security and enhance strategic decision-making capabilities, with profound implications for modern military and security systems.^[4]

3. In-Depth Analysis of Multi-Source Radar Signal Fusion Technology

3.1 Prerequisites of Data Synchronization and Spatial Registration

In the in-depth analysis of multi-source radar signal fusion technology, data synchronization and spatial registration, as fundamental steps in the fusion process, are of paramount importance. Data synchronization primarily addresses the issue of time alignment, ensuring that data from different radar sources can be compared and analyzed at the same time point. This requires highly consistent time stamps for each radar system to ensure accurate correspondence of data points during fusion processing, ensuring temporal consistency for subsequent processing. Spatial registration involves aligning data in the spatial dimension, ensuring that radar data from different angles and positions can be fused within a unified spatial reference framework. This requires complex coordinate transformation processing and consideration of factors such as geometric distortions and installation errors of radar systems. Through precise calibration, spatial consistency of data can be ensured. Only with the accurate handling of these two prerequisites can multi-source radar signal fusion technology proceed on the basis of accurate alignment, effectively enhancing the accuracy and reliability of the final fusion results.

3.2 Application and Optimization of Signal Fusion Algorithms

Signal fusion algorithms, as key enablers for efficiently integrating multi-source radar data, play a crucial role. Through sophisticated algorithm design, these technologies can fuse information from different sensors into a unified, high-quality dataset, significantly improving the accuracy and usability of information. Among the numerous fusion algorithms, the weighted average method is widely applied for processing data sources with similar signal-to-noise ratios due to its simplicity and intuitiveness. The Kalman filter algorithm is renowned for its excellent performance in estimating dynamic system states, especially for linear systems with known noise characteristics, where it can provide highly accurate estimation results. The particle filter algorithm demonstrates its unique advantages in handling complex systems with nonlinear and non-Gaussian noise, providing powerful tools for state estimation in various complex environments.^[5]

Selecting the most suitable signal fusion algorithm and optimizing it are key steps in improving the performance of multi-source radar systems. This process not only considers the efficiency of the algorithm itself in processing real-time data but also involves meticulous adjustments and optimizations based on specific application scenarios and data characteristics. Algorithm optimization includes but is not limited to parameter adjustments, careful design of fusion strategies, and enhancement of algorithm adaptability to specific environmental conditions and target characteristics. Through in-depth research and optimization of these aspects, the accuracy of fused data can be effectively improved, enabling multi-source radar systems to demonstrate outstanding performance in processing various complex data. In summary, the application and subsequent optimization of signal fusion algorithms are not only technological challenges but also key elements in enhancing the overall performance of radar systems, achieving precise and efficient target detection. [6]

3.3 Evaluation Methods for Fusion Effectiveness

In the in-depth analysis of multi-source radar signal fusion technology, precise evaluation of fusion effectiveness is crucial. This evaluation process involves multidimensional performance indicators such as detection rate, false alarm rate, and accuracy, as well as a deep understanding and application of measurement methods for these indicators. The detection rate, as a measure of the system's ability to successfully identify targets, directly reflects the basic functional performance of the radar system. The false alarm rate is an important indicator for evaluating the system's ability to distinguish between targets and non-targets. A lower false alarm rate indicates a stronger discrimination ability of the system. Accuracy comprehensively considers the accuracy of target positioning and identification, directly reflecting the quality of fusion results. To comprehensively evaluate the effectiveness of multi-source radar signal fusion technology, a series of test scenarios must be designed and implemented to simulate target detection under different environmental conditions, enabling comparative analysis of the performance differences of different signal fusion algorithms and strategies

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in practical applications.

Furthermore, advanced statistical analysis methods such as the application of Receiver Operating Characteristic (ROC) curves provide more scientific and comprehensive analysis tools for evaluating fusion effectiveness. The ROC curve depicts the relationship between the true positive rate (TPR) and false positive rate (FPR) of the system at different decision thresholds, providing an intuitive view of the system's ability to maintain a low false alarm rate while achieving a high detection rate. Through ROC curves, researchers and system designers can clearly identify the advantages and limitations of different signal fusion algorithms and strategies in specific application contexts, providing a solid scientific basis for the selection and optimization of fusion strategies. Through meticulous performance evaluation methods, not only can multi-source radar signal fusion technology achieve optimal performance in different application scenarios, but it also provides important references and guidance for the development and application of future technologies.

4. Innovative Applications of Multi-Source Radar Signal Fusion Technology in Airborne Target Detection

4.1 Strategies and Technologies for Precise Target Identification

Precise target identification occupies a crucial position in multi-source radar signal fusion technology, utilizing advanced algorithms and signal processing techniques to meticulously discern and accurately identify unique features of airborne targets. At the core of this process lies the effective utilization of abundant data resources provided by multi-source radar systems, including but not limited to multi-angle observation information and multidimensional data analysis. When these data are combined with machine learning and artificial intelligence algorithms, the accuracy of target identification is significantly enhanced. Particularly, the application of deep learning models, through in-depth learning and representation of target features, can identify specific targets with remarkable accuracy in vast datasets. When faced with target identification tasks in complex environmental conditions, adaptive filtering technology and precise feature selection algorithms play irreplaceable roles. Through intelligent data processing, they effectively improve the identification rate while significantly reducing false alarms, optimizing the efficiency and speed of the entire target identification process.

With continuous technological advancements, precise target identification strategies have also made significant progress in real-time performance. These advancements are not only reflected in algorithm optimization but also in the deep application of complex signal processing techniques. For example, by fusing data from different sensors and combining time-series analysis with spatial geometric analysis, the system can rapidly lock onto and track targets in rapidly changing airborne environments. Furthermore, with the development of artificial intelligence technology, the application of self-learning and adaptive algorithms in target identification provides new possibilities for enhancing the system's dynamic adaptability and ability to handle complex scenarios. The integration and application of these technologies not only greatly improve the accuracy and real-time performance of airborne target identification but also drive radar signal processing technology to higher levels, paving the way for innovation and application in future airborne target detection technology.

4.2 Methods and Challenges of Efficient Target Tracking

Efficient target tracking capability is one of the core applications of multi-source radar signal fusion technology in airborne target detection, involving the accurate identification and prediction of dynamic behavior of moving targets by the system. In this process, the system needs to address and overcome a series of challenges such as target occlusion, signal interference, and environmental noise, all of which may significantly affect the continuity and accuracy of tracking. By adopting a multi-source data fusion strategy and using advanced algorithms such as Kalman filters, particle filters, the system can effectively integrate information from different radar sources to provide real-time and accurate state estimation for dynamically changing targets. This approach not only improves the predictive accuracy of target motion trajectories but also enhances the system's adaptability in complex environments.

With continuous technological advancements, researchers have begun to explore and develop new algorithms to solve the problem of multi-target tracking and occlusion. These include methods based on Multiple Hypothesis Tracking (MHT) and Random Finite Sets (RFS), which provide more flexible and efficient solutions for tracking problems in multi-target scenarios. The MHT algorithm handles the

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uncertainty of targets by generating and maintaining multiple hypotheses, while the RFS method uses random sets to describe and infer the number and status of targets, both showing great potential in improving the decision quality and reducing misjudgments during tracking. These advanced tracking algorithms not only enable multi-source radar systems to monitor and predict the behavior of airborne moving targets more accurately but also greatly promote the development of radar signal processing technology, providing new ideas and methods for future airborne target detection and surveillance.

4.3 Demonstrations of Application Effects in Practical Scenarios

The effectiveness of multi-source radar signal fusion technology in practical applications is direct evidence of its innovation and effectiveness. By applying it in diverse real-world scenarios, including but not limited to complex urban environments, rugged mountainous terrain, and expansive maritime areas, this technology has demonstrated its wide applicability and significant advantages in airborne target detection. Particularly, in urban environments, multi-source radar signal fusion technology effectively overcomes signal occlusion and reflection caused by tall buildings and complex terrain, significantly improving the coverage and identification accuracy of target detection. In open environments such as mountainous regions and the sea, its advantage in utilizing multi-angle observation enhances the continuity and accuracy of tracking low-visibility targets such as small drones or other flying objects.

Furthermore, the application of multi-source radar signal fusion technology in specific fields demonstrates its important contributions to public safety and response efficiency. For example, in air traffic monitoring, this technology greatly enhances the monitoring capability of aircraft through real-time integration of data from different sensors, ensuring aviation safety. In border security patrol applications, it effectively enhances monitoring efficiency and response speed through high-precision target identification and tracking, strengthening border security protection. In natural disaster response and rescue operations, multi-source radar signal fusion technology can rapidly and accurately identify disaster areas and dynamic changes, providing crucial information support for rescue decision-making. These practical application cases not only fully demonstrate the application effects of multi-source radar signal fusion technology in different environments and fields but also validate its significant value in enhancing monitoring capability, improving security, and optimizing response efficiency.

5. Conclusion

The research and application of multi-source radar signal fusion technology in the field of airborne target detection have demonstrated significant technical advantages and broad application prospects. Through in-depth analysis of the importance of data synchronization and spatial registration, as well as the application and optimization of signal fusion algorithms, this study proposes an efficient strategy for target identification and tracking. The practical application effects indicate that this technology can significantly enhance the accuracy and efficiency of target detection in different environments, especially in detecting low-visibility targets in complex environments. In summary, multi-source radar signal fusion technology provides an effective approach to solving key problems in airborne target detection and is of strategic importance for enhancing the performance of modern defense and monitoring systems. Future research will further explore the optimization path of this technology and its application potential in a broader range of fields.

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