Coordinated radar resource management for networked phased array radars

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Abstract

A phased array radar has the ability to rapidly and adaptively position beams and adjust dwell times, thus enabling a single radar to perform multiple functions, such as surveillance, tracking and fire control. A radar resource manager prioritises and schedules tasks from the various functions to best use available resources. Networked phased array radars that are connected by a communication channel are studied. This paper considers whether coordinated radar resource management (RRM), which exploits the sharing of tracking and detection data between radars, enhances performance compared to Independent RRM. Two types of distributed management techniques for Coordinated RRM are proposed, with each type characterised by varying amounts of coordination between the radars. A two-radar network and 30-target scenario are modeled in the simulation tool Adapt_MFR, to analyse the performance of the two Coordinated RRM techniques against the baseline case of Independent RRM. Results indicate that the Coordinated RRM techniques achieve the same track completeness as Independent RRM, while decreasing track occupancy and frame time. Therefore, Coordinated RRM can improve reaction time against threats, at the expense of sending data across a communication channel. The performance of Coordinated RRM for a communication channel with errors is also modeled and analysed.

1 Introduction

Military systems are increasingly considering task force operation, where multiple platforms are deployed to an area of interest. This focus has resulted in research activity in sensor resource management, which optimises the assignment of multiple sensors to multiple tasks [1]. Sensor

resource management takes place at the Command and Control (C2) level and attempts to answer the question of what tasks should be assigned to various sensors. For a complex sensor such as a phased array radar, an equally important question considers how the sensor should schedule each of its assigned tasks. Because a phased array radar has the ability to rapidly and adaptively position beams and adjust dwell times, a single radar can perform multiple functions, such as surveillance, tracking and fire control. A radar resource manager prioritises and schedules tasks from the various functions. While sensor resource management operates among many sensors on one or more platforms at the C2 level, radar resource management (RRM) operates on a single platform at the single sensor (radar) level to make the best use of the flexibility of a phased array radar [2].

Previous work on RRM has considered adaptive techniques which vary with the number and type of tasks to be executed by the radar. **Task prioritisation** quantifies the relative importance of tracking and surveillance tasks that must be carried out by the radar [3], [4]. In prioritising target tracks, the estimated characteristics of the target and the environment are used to compute relative priorities. For surveillance tasks, a priori information about threats and the recent history of detections and tracks can be used to compute the relative priority of a sub-region compared to another. Adaptive tracking, including adaptive track update intervals, were considered in [5–10]. **Task scheduling** involves deciding which look requests should be scheduled and specifying the starting time of each scheduled look [11–16]. Scheduling algorithms typically make use of relative task priorities in formulating the radar schedule, and may incorporate adaptive track update intervals.

Track scheduling for networked radars has been considered by He and Chong [17, 18], who model the sensor scheduling problem as a partial observable Markov decision process and formulate a scheduling solution based on particle filtering. In [19], track scheduling is carried out using a modified Quality-of-Service Resource Allocation Model. Track scheduling methods have also been proposed to minimize sensor loading [20, 21]. By contrast, this work considers the scheduling of both tracking and surveillance tasks for networked radars, and quantifies both tracking and surveillance performance. In addition, the techniques presented here adaptively schedule tasks based on the characteristics of the targets within the coverage areas of the radars.

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This paper considers a network of phased array radars which are connected by a communication channel [22]. The purpose of this work is to determine how the sharing of tracking and detection data among radars in the network can be used to enhance RRM performance. For the remainder of this paper, the term "resource management" will refer to radar resource management, as opposed to the C2 concept of sensor resource management. The networked concepts developed will be referred to as **Coordinated RRM**, since the data from other radars is exploited in carrying out RRM. High-level concepts for Coordinated RRM will be formulated. In addition, results from the simulation of a two-radar network will illustrate the performance gains that are possible with Coordinated RRM.

Section 2 discusses radar network terminology, previous work in distributed tracking, and performance metrics. Section 3 formulates two distributed management techniques for Coordinated RRM. Section 5 presents an overview of the simulation tool Adapt_MFR, which will be used to demonstrate and analyse Coordinated RRM performance. In Section 6, Coordinated RRM for a two-radar network is analysed in modeling and simulation, and compared to the baseline case of Independent RRM. Finally conclusions are presented in Section 7.

2   Preliminaries

Figure 1 illustrates the role of a resource manager for a single radar. In this study, the radar functions considered are surveillance and tracking. Each function consists of one or more tasks. For the target tracking function, a task involves the tracking of an individual target, while for the surveillance function, a task involves the monitoring of a specified region of interest. Each task consists of several looks, where a look requires one continuous time interval of finite duration to be completed. For a tracking task, a look is an attempt to update a track by steering the radar in the direction of the expected location of the target. For a surveillance task, a look consists of one or more beam positions of the radar. Each task sends look requests to the radar scheduler. For a target tracking task, a look request may consist of an attempt to update a track at a specified time. Each task makes look requests independently, based only on its own requirements. The radar scheduler receives all look requests and formulates a schedule for the radar, under the constraint that at any given time, the radar only executes one look. The radar scheduler must decide whether

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or not to schedule the look request.
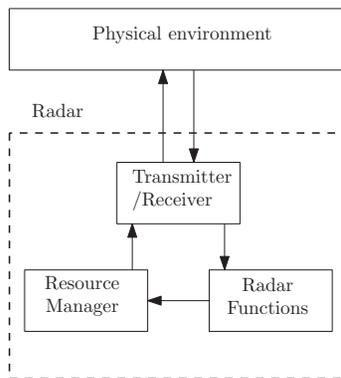
Figure 1: Resource management for a single radar.

This paper presents the formulation of Coordinated RRM for networked radars, where detection and tracking data from other radars is used in radar scheduling. In order to develop these Coordinated RRM techniques, a number of preliminary concepts are discussed in this section, including radar network terminology, distributed tracking, and performance metrics.

2.1 Radar networks

This paper considers the resource management of a network of N monostatic radars. The portion of the network that is colocated with a radar antenna will be referred to as a node. Different types of resource management architectures for radar networks can be formulated, and each may lead to different solutions for the resource management problem. This work considers **distributed management** techniques, which will be specified later in this paper. **Centralised management** techniques are not considered here.

An element common to the radar networks is a communication channel. The channel capacity, or maximum throughput, is a key element of networked radar and may vary with time.

The relationship between the coverage areas of the radar nodes is an important characteristic of the network. Consider the case when two or more nodes have coverage areas that overlap. Define the nodes with overlapping coverage areas as contributing nodes. The common coverage area will be called the overlapping region, as shown for the two node case in Figure 2. Coverage area is defined

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in range and angle. Each coverage area may have different range and angular extents, so that any overlapping regions will vary with range and angle. For a tracked target or surveillance region that is located in the overlapping region, the resource manager must decide which contributing node should carry out the associated surveillance or tracking task.
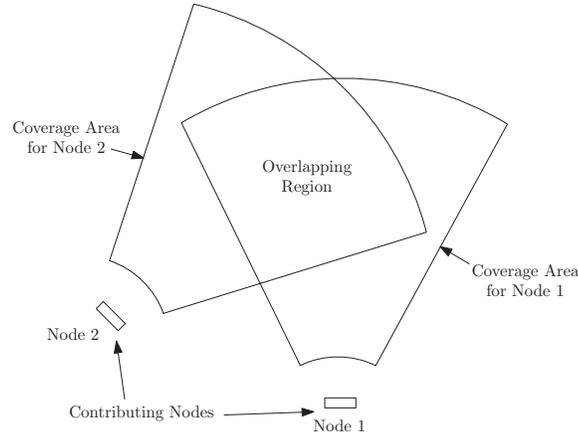

Figure 2: Two nodes with overlapping coverage areas.

If the coverage areas of each node do not overlap, then each node would be managed as in the single-radar case. If coverage areas are adjacent to each other, then tracks could be handed off from one radar to a radar with an adjacent coverage area.

2.2   Distributed tracking

The extension of RRM to networked radars will build on previous results from distributed tracking in distributed sensor networks. Data association, which is the association of measurements from one or more sensors to the same target, is a key problem in multiple target tracking. When multiple sensors are connected by a communication channel, the information to be communicated on the channel must be determined. For the case of multiple hypothesis tracking, tracking performance was analysed when a subset of hypotheses and tracks are communicated between the sensors [23]. When joint probabilistic data association (JPDA) is used in a distributed sensor network, [24] showed that a global tracking estimate is formed by communicating the local estimates of each target along with the feasible events and their probabilities. Increasing the effective tracking update rate with a large network of track-while-scan radars was considered in [25]. A technique was presented for increasing

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the effective update rate while maintaining a reasonable communications bandwidth.

Two types of distributed tracking [26] are considered in this paper. For Independent RRM, each radar conducts tracking independently of the other radars in the network, and the tracks are initiated and maintained separately. For Coordinated RRM, a single track is created for each target, and detection-to-track data association is conducted for detections from all radars in the network.

2.3 Performance metrics

RRM performance can be quantified using a number of metrics, including the Single Integrated Air Picture (SIAP) metrics for tracking [27]. In this work, RRM performance will be measured by evaluating track completeness, track occupancy and frame time. Track completeness C is given by

$$C = \frac{\text{total time interval over which any track number is assigned to target}}{\text{total time that target is in the defined coverage area of radar}} \tag{1}$$

so that $0 \leq C \leq 1$. The coverage area is defined as the region where the signal-to-interference ratio exceeds a specified threshold. The signal-to-interference ratio is computed based on the highest energy waveform that is possible to transmit. In this study, interference will only include noise. In a real system, interference may include clutter and could be affected by environmental effects such as ducting. Such interference would affect the maximum detection range, and therefore the defined coverage area, of the radar.

Track occupancy is the fraction of available radar time that the radar is either transmitting waveforms or receiving the returns from transmissions related to tracking functions. Surveillance frame time is the time between surveillance looks in a given region of space. For a specified region, either average frame time or maximum frame time can be measured. In an ideal case, track completeness is large, and track occupancy and frame time are small.

The goal of this work is to develop Coordinated RRM techniques that demonstrate enhanced performance compared to Independent RRM techniques. Performance will be measured by computing track completeness, track occupancy and frame time.

3 Distributed techniques for coordinated radar resource management

Coordinated RRM includes the scheduling of tracking and surveillance tasks, the processing of tracking and detection data from other radars, and the specification of techniques for distributed tracking. As such, it addresses a time-varying multidimensional optimisation problem. This section formulates two Coordinated RRM techniques employing a distributed management architecture.

In a network with distributed management, each node is a radar that operates autonomously and has a dedicated resource manager, as shown in Figure 3. The resource managers communicate with each other through the communication channel. Note that tracking and detection data is shared via the resource managers. The information transmitted on the communication channel will vary depending on the resource management method that is employed. With distributed management, each node is autonomous and can operate independently in the absence of communication from all other nodes.
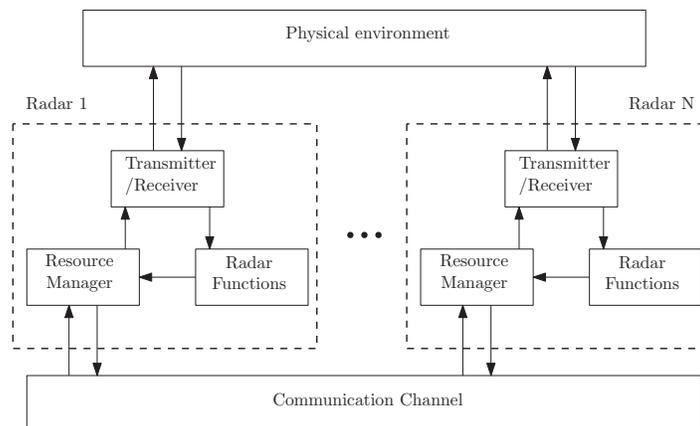

Figure 3: Radar network with distributed management architecture.

A degenerate case of distributed management is the case where no communication channel exists. This case will be called Independent RRM and serves as a baseline against which Coordinated RRM techniques will be compared.

For networks with distributed management, each node communicates its coverage area to the other nodes in the network. If none of the nodes overlap, then each node operates independently. If

nodes have adjacent coverage areas, then it may be possible to hand off tracks between the nodes.

Consider the case where overlapping regions exist. The surveillance and tracking tasks can be partitioned into overlapping tasks and exclusive tasks. Overlapping tasks are those where the associated target or surveillance region is located in an overlapping region. All other tasks are then exclusive tasks. When overlapping regions exist, a contributing node can coordinate its schedule with other contributing nodes.

For overlapping tasks, all nodes have the current estimate and relevant track information for a tracking task, and the time of the last update and detection rates for a surveillance task. The position and orientation information of other nodes allows a local node to map the received tracking and surveillance data into the local coordinate frame.

When overlapping regions exist, various types of distributed management for the contributing nodes can be specified. These are detailed in this section and are summarised in Table 1. The type of distributed management employed by a radar node can change with time, depending on factors including the number of contributing nodes, the size of the overlapping region, the number of overlapping tasks, and the channel capacity.

Table 1: Types of distributed management.

Name	Description
Type 0	Independent management.
Type 1	Autonomous management with assignment of overlapping tasks.
Type 2	Autonomous management with assignment of overlapping looks.

Specific scheduling techniques for a two-radar network are formulated below. For these techniques, RRM is coordinated for tracking tasks only. Surveillance tasks are conducted independently for the two radars. Errors on the communication channel may cause the channel to not be available for certain durations of time. This will be modeled in Section 4. For Coordinated RRM techniques, the data to be communicated between the radars will be specified.

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3.1 Independent RRM

In this case, each radar carries out Independent RRM for all tasks. This was referred to as Type 0 management in Table 1 and is the baseline case against which Coordinated RRM will be assessed. No data is communicated between the radars. Each radar utilizes an independent tracker and employs independent RRM that includes three aspects of adaptivity:

1. Fuzzy logic prioritisation

2. Adaptive track update intervals

3. Time-balancing scheduling

The fuzzy logic prioritisation technique [3] is implemented for tracking tasks. For each tracked target, characteristics such as heading, range, range rate, height and manoeuvre history are used to compute a target priority value between zero and one. In this way, the relative priority of each tracked target is assessed, so that more radar resources can be assigned to higher priority targets.

The tracker requests an update interval for each tracked target, and this request is sent to the scheduler. The requested track update interval depends on the target priority as follows,

$$\text{Requested track update interval} = \begin{cases} 1.5 \text{ s}, & \text{if target priority} \geq 0.75 \\ 3 \text{ s}, & \text{if target priority} < 0.75 \end{cases}, \tag{2}$$

where the target priority is a value between zero and one. If the track updates are scheduled at their requested intervals, then targets with a priority greater than 0.75 are updated twice as frequently as lower-priority targets.

The scheduling of tracking and surveillance tasks is conducted using the time-balancing scheduler [11], [28]. Each task has an associated time balance. If a look associated with that task is not scheduled, then the task time balance increases linearly with time. If a look is scheduled, the time balance decreases. At any given time, the task with the highest time balance is scheduled next.

3.2 Type 1 Management

When the channel is available, Type 1 Management assigns overlapping tracking tasks to the radar that has the smaller range to the tracked target. Once the overlapping task has been assigned to a

radar, that radar carries out all track updates until the track ends. An overview of the assignment rules for tracking tasks is shown in Figure 4. Each radar conducts surveillance over its entire coverage area. Each radar also conducts tracking of its exclusive tracking tasks.
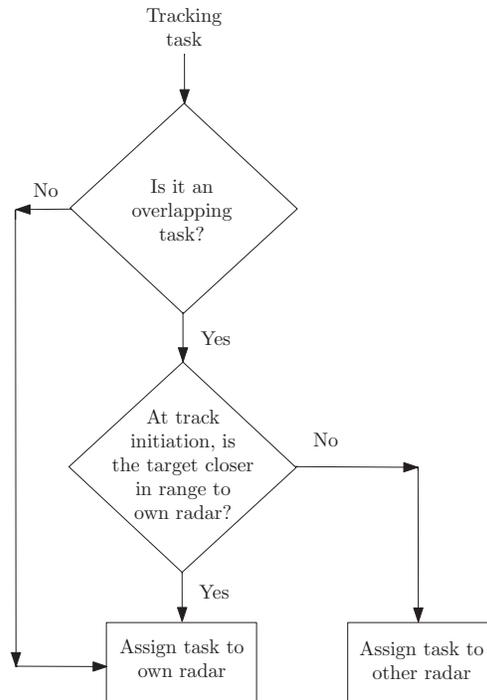

Figure 4: Task assignment algorithm for Type 1 Management.

For assigned tracking tasks, the fuzzy logic algorithm is used to compute the relative priorities of each tracked target. Adaptive track update intervals are computed using (2). Surveillance looks and tracking looks are then scheduled using the time-balancing scheduler.

Detection-to-track association is carried out for all tracks, including tracks assigned to the other radar. For example, assume that track y is assigned to Radar 1. In the course of conducting surveillance, a detection by Radar 2 will be gated against all tracks, include that of track y. If the detection is gated to track y, then the detection will be used to update track y. If the detection is not gated to track y, then Radar 1 schedules a track confirmation look.

For Type 1 Management, the data sent across the communication channel is specified in Table 2. The position, velocity and orientation of each radar platform are sent to the other platform, so that

Table 2: Data sent across the communication channel for Type 1 Management.

Platform	Overlapping tasks
- Position	- Detections
- Velocity	- Estimated position at
- Orientation	track confirmation

both radars can compute coverage areas and the overlapping region, if any. This data also allows detections from the other radar to be mapped into the local coordinate frame. The estimated position of targets at track confirmation is required to compute the task assignment algorithm. Once an overlapping tracking task has been assigned to a particular radar, only detections in the overlapping region are sent across the channel.

In Type 1 Management overlapping tasks are not assigned to both radars, which reduces the time required for tracking tasks compared to Independent RRM. In particular, the radar that is not assigned to a particular track does not assign looks to update that track, which frees up the radar to carry out other tasks. The benefit gained from the coordinated scheduling of overlapping tasks will be quantified in Section 6.

3.3 Type 2 Management

When the channel is available Type 2 Management assigns overlapping tracking tasks to a radar on a look-by-look basis. Each look is assigned to the radar that has the smaller range to the tracked target. An overview of the assignment rules for tracking looks is shown in Figure 5. Note that Type 2 Management is computationally more intensive than Type 1 Management, because a comparison of the target ranges to each radar is carried out for each look associated with a tracking task. Each radar carries out surveillance of its entire coverage area and conducts tracking of its exclusive tracking tasks.

After each tracking look has been scheduled, the next look is assigned to a radar based on minimum range. The fuzzy logic priority (relative to the assigned radar) and the adaptive track

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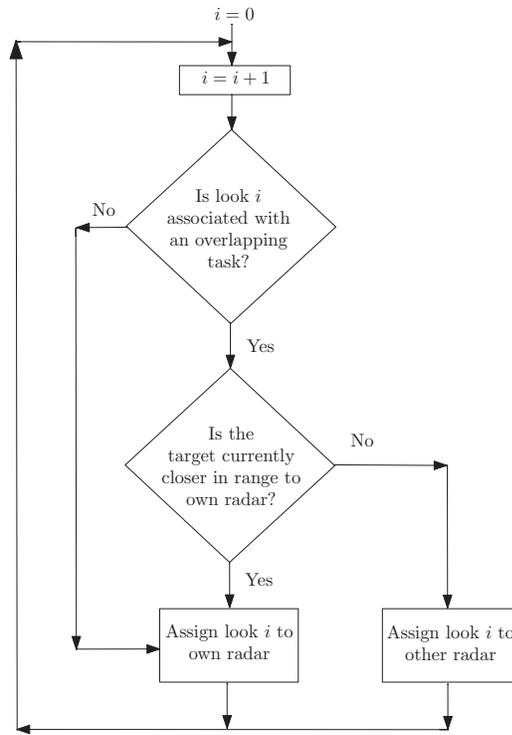
Figure 5: Look assignment algorithm for Type 2 Management, for looks $i = 1, 2, ...$ of a given tracking task.

update interval are computed. Surveillance looks and assigned tracking looks are scheduled for each radar using the time-balancing scheduler. As was the case with Type 1 Management, detection-to-track association is carried out for all tracks, including tracks assigned to the other radar.

Table 3: Data sent across the communication channel for Type 2 Management.

Platform	Overlapping tasks
- Position	- Detections
- Velocity	- Tracks
- Orientation	

For Type 2 Management, the data sent across the communication channel is specified in Table 3. The position, velocity and orientation of each radar platform are sent to the other platform, so that both radars can compute coverage areas and the overlapping region, if any. Detections and tracks associated with overlapping tasks are required, since the estimated range to each radar is used to compute the look assignment on a look-by-look basis. A given track may be updated by either radar, using scheduled track update looks or detections from surveillance looks that are gated with the track.

3.4   Target prioritisation for radar networks

Target prioritisation techniques allow a radar resource manager to prioritise multiple tasks in order to develop a more effective radar schedule. To date, target prioritisation has been considered for resource management of a single radar. This subsection considers the prioritisation of targets that are in the coverage area of multiple radar nodes.

Fuzzy logic prioritisation [3] considers a number of variables in computing a priority value for tracking tasks and surveillance tasks. For tracked targets, five variables are considered: track quality, hostility, degree of threat, weapon system capabilities, and relative position of the target.

For a given target and in the absence of communication between the nodes, the priority computed by each radar will likely vary. For example, the relative position of the target to each radar

will likely be different. Further, if the radars are significantly separated in space, the heading and range rate, which help determine the degree of hostility, will be different for each radar. This case results in a target having a different priority relative to each radar.

An alternative approach is to compute an absolute priority for each target. The input variables for fuzzy logic prioritisation can then be defined in a way that is uniform across the network. For example, the relative position could be computed relative to the radar that is closest to the target. In this case, either all radars could compute the priority using knowledge of the other radars in the network, or one radar could compute the priority and communicate the result to the other radars.

For the prioritisation of surveillance sectors, four variables are considered: new targets rate (over time), number of threatening targets, threatening targets rate (over time), and original priority. For sectors that fall within the coverage area of multiple radars, it may be that the detection rate differs for each radar, due to differing clutter or noise levels, differing relative target velocities, or unfavourable aspect angles with respect to radar cross section.

4   Model for Communication Channel Availability

To implement Coordinated RRM techniques, the radar network relies on a communication channel between radars to transmit and receive data related to target detections and tracks. It is assumed that the radar network employs a digital communication system with Forward Error Correction (FEC) channel coding [29]. If the Bit Error Rate (BER) of the channel is less than or equal to the maximum BER of the FEC code, then the data is received without error. However, if the BER of the channel is greater than the maximum BER of the FEC code, then the data is not received reliably.

This paper models the effects of errors on the communication channel, together with error control coding employed by the communication system. When the BER of the channel is less than or equal to the maximum BER of the FEC code, then the channel is available. When the BER of the channel is greater than the maximum BER of the FEC code, then the channel is not available. Over time, the channel is available with probability p. This realistic model for channel availability accounts for errors that may occur due to interference on the channel, together with error control

coding that would be employed by the communication system.

5   Adapt MFR simulation tool

Adapt_MFR is a full radar simulation package that was designed and developed at Defence Research and Development Canada (DRDC) Ottawa to analyse the performance of radar resource management techniques for naval radars operating in a littoral environment. Adapt_MFR runs causally, producing detection output results for one beam at a time.

An illustration of the high-level Adapt_MFR simulation architecture is presented in Figure 6. The framework consists of a series of modules (left hand side) that describe the radar(s), target scenario, and environment which are required to provide input to the simulation. The simulation flow located in the centre section of the figure represents the running code, which makes use of the data and associated functionality (algorithms, models, etc.). Adapt_MFR uses a tracker which employs an Interacting Multiple Model (IMM) algorithm with a constant velocity model and a Singer manoeuvring model for estimating target dynamics. The measurement models include range, range rate, bearing and elevation. Detection-to-track data association is carried out using Nearest Neighbour (NN) JPDA [30].

In order to analyse the performance of RRM techniques, Adapt_MFR is operated in a simulation mode with an IMM tracker. An overview of this mode is shown in Figure 6. To operate in this mode, user inputs are accepted through a graphical user interface and stored into corresponding radar, scheduling, environmental, and other data structures. Target initial positions and trajectories are set by the user. The simulator runs in a loop, with time incremented in each pass by the dwell time of the radar beam, until the simulation time ends. Surveillance continues until a detection occurs and a confirmation is scheduled for that detection. Target detection modeling is based on the radar range equation. Signal-to-noise ratio and detection probabilities are computed, and the detection of a target is determined based on a Monte Carlo test. For each successful target confirmation, a measurement report is sent to the tracker. Predictions are requested at specific scheduled times based on user-defined rules to determine track update intervals. Based on the radar scheduling algorithm being modeled, future surveillance and tracking beams are assigned at

**Input
Parameters**

**Simulation
Flow**

| Radar |

| Targets |

| Environment |

- calculate target trajectories

- set measurement resolutions, beam pattern specifications, environmental conditions, etc.

- initialize tracking and scheduler parameters

- compute track update intervals

- implement radar scheduler, including task prioritization

- compute full radar range equation and detection probabilities

- determine target detection based on Monte Carlo test

- add appropriate random perturbations to detection measurements

Detections

**Interactive Multiple
Model Tracker**

Tracks

Figure 6: High-level overview of the simulation mode with IMM tracker in Adapt_MFR.

specific times. Adapt_MFR is capable of modeling networked radars with an arbitrary number of radars. Multiple-radar tracking is also enabled.

Adapt_MFR accurately assesses RRM performance by causally modeling radar operation on a beam-by-beam basis. Radar detections are input to an IMM tracker. The tracker is then capable of sending track update requests to the radar scheduler. Tracking performance is analysed by comparing tracker outputs to ground truth data.

6 Two-radar network example

Section 3 formulated techniques for coordinated radar resource management. In this section, a two-radar network example is considered, and the performance of these techniques is analysed. The performance analysis utilizes the Adapt_MFR simulation tool, which was described in Section 5.

The scenario is shown in Figure 7 and is specified as follows. The two radars are stationary and are separated by 10 km, with the second radar located directly south of the first radar. The boresites of both radars point directly east. Each radar is capable of scanning ±60 degrees in azimuth.

The scenario consists of 30 targets with trajectories defined over a time interval of 200 seconds. Each target has a fixed altitude, radar cross section (RCS), and velocity. In addition, each target follows one of three trajectory types. The targets have varying values of initial position and initial heading, which are chosen so that each target trajectory is within the azimuthal coverage extent of one or both radars for the entire time interval.

Two sets of targets are considered: Target Set A and Target Set B. The parameter values for the target sets are listed in Table 4. It is seen that Target Set B has targets with smaller RCS and larger velocity values. Figure 7 shows a top-down view of the radar locations and target trajectories for Target Set A.

Adapt_MFR simulations were run for the scenario with Target Set A. The following five cases were considered, where p is the probability of channel availability, as described in Section 4.

1. Independent RRM

Table 4: Set of parameter values for 30 targets.

| Parameter	Values: Target Set A	Values: Target Set B
Altitude (m)	500, 600, 750	500, 600, 750
Velocity (m/s)	100, 150	200, 250
Radar cross section (m^2)	50, 75	5, 10
Trajectory	Straight line, U-turn, Weave	Straight line, U-turn, Weave
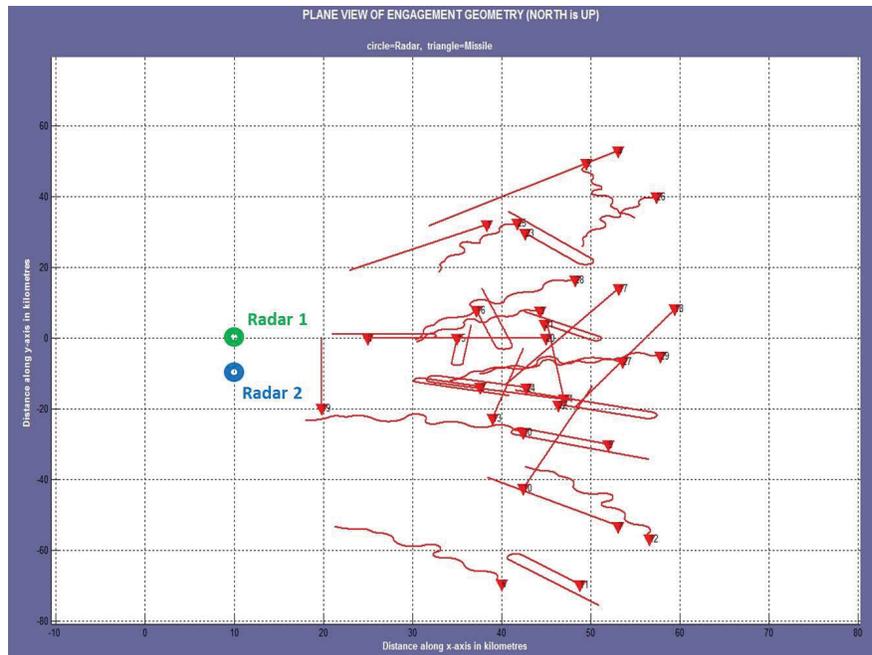
Figure 7: Top-down view of radar positions and target trajectories for the scenario with Target Set A. Triangles indicate target position at the start of its trajectory.

2. Type 1 Management with $p = 1$

3. Type 2 Management with $p = 1$

4. Type 1 Management with $p = 0.5$

5. Type 2 Management with $p = 0.5$

An IMM tracker with NN-JPDA [30] was utilized in all cases. The track initiation process is as follows. After a target detection, the radar specifies a target confirmation look for that target. If the target is confirmed, then a tentative track is formed. After a tentative track has been updated two times in three attempts, the tentative track becomes a confirmed track. For the purposes of computing track occupancy, track confirmation looks are associated with target detection, while update looks for tentative tracks or confirmed tracks are associated with target tracking.

For the case of Type 1 Management with $p = 1$, Figure 8 shows the number of tracks with priority greater than or equal to 0.75, and the number of tracks with priority less than 0.75. Both are plotted against simulation time for each radar. The priority of a track determines the requested track update interval, as specified in (2). The total number of tracks may not always equal the number of targets, 30, because at certain brief periods of time during the simulation, there may be untracked targets or false tracks.
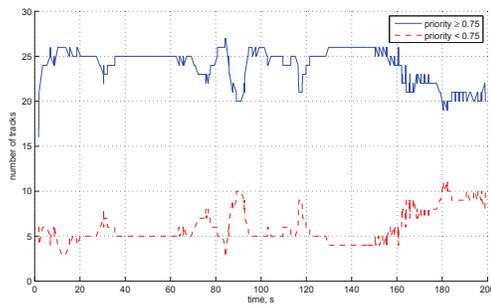

(a) Radar 1.
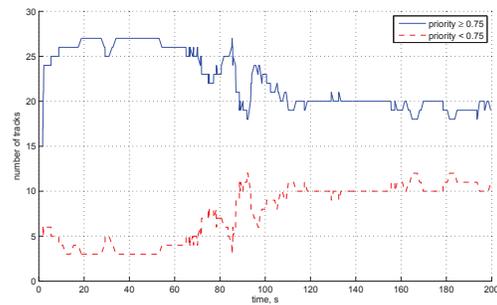
(b) Radar 2.

Figure 8: Number of high-priority and low-priority tracks for Type 1 Management for Target Set A.

For $p = 1$, the communication channel was available during the entire simulation. For $p = 0.5$,

the simulation time interval of 200 seconds was divided into subintervals of 10 seconds. For each subinterval, the channel was randomly chosen as either being available or not available, with equal probability. For Type 1 Management with $p = 0.5$, a transition from the channel being available to not available resulted in the two radars initiating new tracks independently. When the channel transitioned from being not available to available, multiple tracks of the same target were fused into a single track. For Type 2 Management with $p = 0.5$, a transition from the channel being available to not available required that existing tracks be assigned to one of the radars. Each track was assigned to the radar that most recently updated the track. As was the case with Type 1 Management, when the channel transitioned from not available to available, multiple tracks of the same target were fused into a single track. Track-to-track association was carried out using target ground truth to associate multiple tracks with each target. Track-to-track fusion was then performed using an averaging scheme, which resulted in only one track being associated with each target. In a real-world environment, track-to-track association and fusion could be carried out statistically [26, pp. 195-97].

Figure 9 shows track completeness for the six cases of Independent RRM - Radar 1, Independent RRM - Radar 2, Type 1 Management with $p = 1$, Type 2 Management with $p = 1$, Type 1 Management with $p = 0.5$, and Type 2 Management with $p = 0.5$. Track completeness was computed as specified in (1). For Independent RRM, tracking is carried out independently for the two radars. The results for Type 1 consider any track that is associated with a given target, regardless of which radar was assigned the track. The results for Type 2 includes tracked targets where updates were carried out by a single radar and those where updates were carried out by both radars, as per the look assignment specified in Figure 5. The results indicate that targets are tracked with track completeness of 0.95 or greater, with the exception of Target 4, whose trajectory is shown in Figure 10. Target 4 starts at a longer range and travels towards Radars 1 and 2. With Independent RRM, Target 4 is not tracked by Radar 2 until later in the scenario, due to lower signal-to-noise ratio at the start of the scenario. This accounts for the track completeness of 0.82 for Independent RRM - Radar 2.

Track occupancy results for both radars are presented in Figure 11. For Type 1 Management and Type 2 Management, tracks associated with targets in the overlapping region are updated by
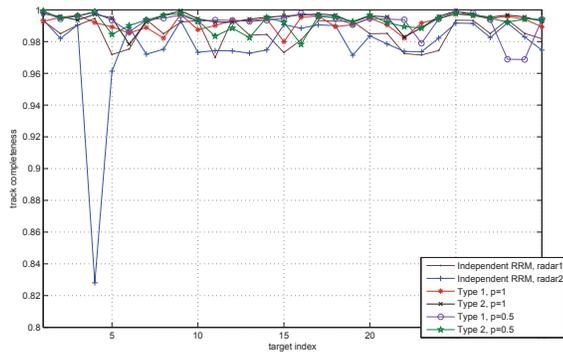
Figure 9: Track completeness for the scenario with Target Set A.
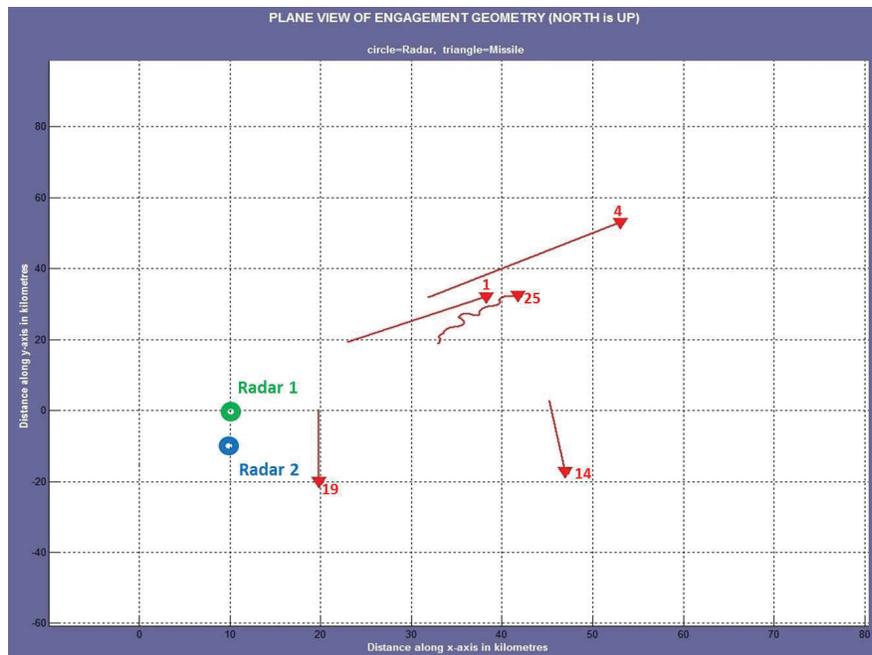

Figure 10: Top-down view of radar locations and select target trajectories for scenario with Target Set A. Triangles indicate target position at the start of its trajectory.

only one of the two radars when the communication channel is available. For Independent RRM, such tracks are updated by both radars, which increases track occupancy for both radars. For fixed $p = 1$ or $p = 0.5$, Type 1 Management and Type 2 Management have similar track occupancy values. Type 1 Management carries out task assignment for overlapping tasks, while Type 2 Management carries out look assignment for overlapping tasks. The distinction between task assignment and look assignment has a negligible effect on track occupancy. The tooth like structure of the track occupancy plots is caused by slight variations in the number of track updates in consecutive fixed intervals. During intervals when the channel is not available, the track occupancy of Type 1 with $p = 0.5$ and Type 2 with $p = 0.5$ increase to that of the Independent RRM case, as expected. This can be seen during the intervals from 50 to 70 seconds and from 130 to 160 seconds.


(a) Radar 1.

(b) Radar 2.
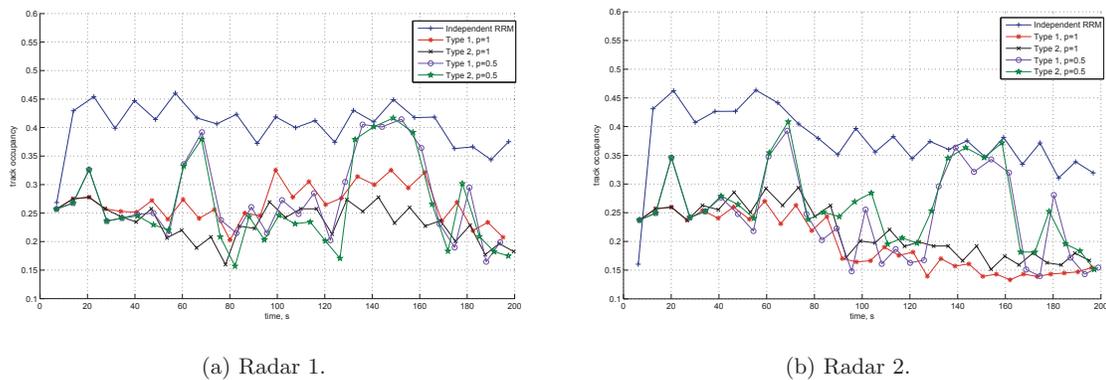
Figure 11: Track occupancy for the scenario with Target Set A.

The decreased track occupancy resulting from the use of Coordinated RRM increases the time available for surveillance. This results in decreased frame time for both radars, as shown in Figure 12. Compared to Independent RRM, the frame time for Type 1 Management, $p = 1$ and Type 2 Management, $p = 1$ is decreased by approximately 2 seconds. As a result, the reaction time against new threats is improved. As expected, the frame time for Type 1 Management, $p = 0.5$ and Type 2 Management, $p = 0.5$ increases to that of Independent RRM when the channel is not available. These results apply to the 30-target scenario under consideration. For a scenario with a larger number of targets in the overlapping region, the frame time for all cases would increase. However, the difference in frame time between Independent RRM and Coordinated RRM would also increase, indicating a more significant advantage for Coordinated RRM.

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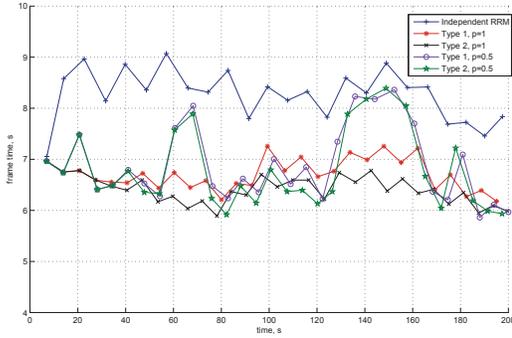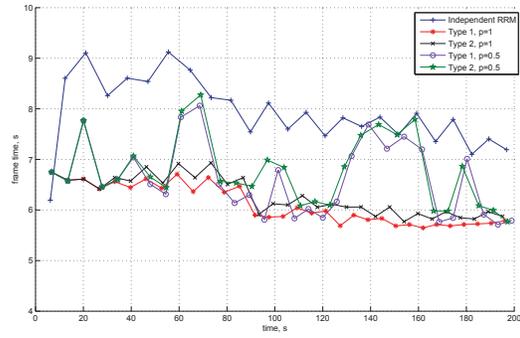
(a) Radar 1.   (b) Radar 2.

Figure 12: Frame time for the the scenario with Target Set A.

Figure 13 plots the difference in position error between Type 2 Management with $p = 1$ and Type 1 Management with $p = 1$, for all 30 targets in Target Set A. Positive difference corresponds with lower Type 2 error. For some targets, Type 1 Management has smaller position error, while Type 2 Management has smaller position error for other targets. For this target scenario, neither the use of Type 1 or Type 2 Management results in smaller estimation error. For a small number of targets, there are periods of time when the estimation error has sharp increases in value for either Type 1 or Type 2 Management, which causes a spike in the difference value plotted in Figure 13. The increase in estimation error value occurs when two or more targets cross paths, and the tracker momentarily associates the track with a different target.
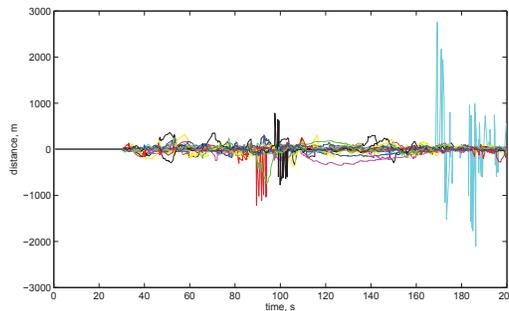

Figure 13: Difference between position error for Type 2 Management with $p = 1$ and position error for Type 1 Management with $p = 1$. Positive difference corresponds with lower Type 2 error.

Figure 14 compares track occupancy for Target Set A with that for Target Set B. Figures 14a and 14b show track occupancy for Type 1 Management with $p = 1$ for Radars 1 and 2. Although the track occupancy is similar for Radar 2, Target Set B has somewhat lower track occupancy for Radar 1. This is because the targets in Target Set B are moving away from the radars at a higher velocity, which decreases target priority and increases track update intervals. For Type 2 Management with $p = 1$, Figures 14c and 14d show track occupancy for Radars 1 and 2. Again in this case, track occupancy is similar for Radar 2, but Target Set B has slightly lower track occupancy for Radar 1. Similar to Type 1, this is caused by higher velocity targets that are moving away from the radars.
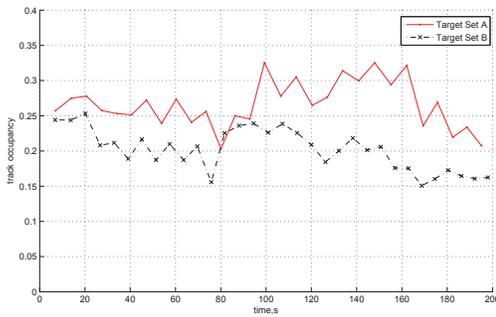
(a) Radar 1: Type 1 Management, $p = 1$.
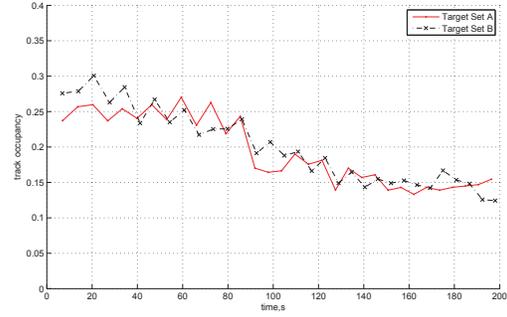
(b) Radar 2: Type 1 Management, $p = 1$.
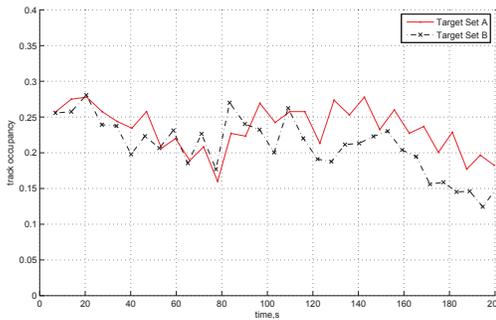
(c) Radar 1: Type 2 Management, $p = 1$.
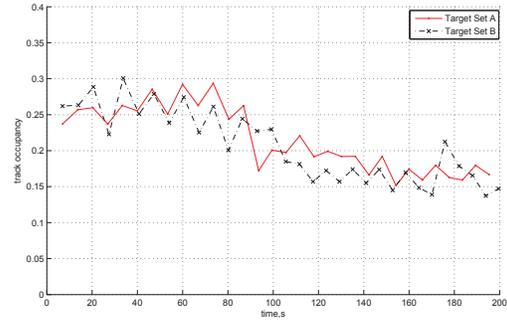
(d) Radar 2: Type 2 Management, $p = 1$.

Figure 14: Comparison of track occupancy for Target Set A and Target Set B.

Results from the 30-target scenario show that Type 1 Management and Type 2 Management achieve track completeness close to one, with similar results for Independent RRM. However, when the communication channel is available, Type 1 Management and Type 2 Management have de-

creased track occupancy and decreased frame time compared to Independent RRM. This indicates that a radar network using Coordinated RRM can improve reaction time against new threats. To achieve this enhanced tracking performance, the radars must send data across the communication channel. The data to be transmitted includes the position, velocity, and orientation of each radar platform, detections associated with overlapping tasks, and the estimated position of targets at track confirmation. In addition, for Type 2 Management, tracks associated with overlapping tasks must be transmitted. When the communication channel is not available, results showed that the performance of Coordinated RRM is similar to that of Independent RRM.

A radar is overloaded when not all tracking look requests can be scheduled. In this case, it is likely that track completeness will not be one for all targets. Coordinated RRM can improve track completeness compared to Independent RRM when the individual radars are overloaded. Overall, differences in track completeness and track occupancy between Type 1 and Type 2 Management will depend on the task assignment and look assignment algorithms.

7   Conclusions

This study considered whether the sharing of detection and tracking data can enhance radar resource management performance. Coordinated radar resource management exploits data that is transmitted across a communication channel. Two types of Coordinated RRM techniques were formulated, with each type characterised by varying amounts of coordination between the radar nodes. A two-radar network and 30-target scenario were modeled in the simulation tool Adapt_MFR, to analyse the performance of Independent RRM and Coordinated RRM. All RRM techniques utilised adaptive task prioritisation, track update intervals, and radar scheduling. It was shown that Coordinated RRM achieves the same track completeness as Independent RRM, while decreasing track occupancy and frame time. Therefore, Coordinated RRM can improve reaction time against threats, at the expense of sending data across a communication channel. The performance of Coordinated RRM for a communication channel with errors was also modeled and analysed. For the examples considered here, there was no difference in performance between Type 1 and Type 2 Management.

The use of Coordinated RRM offers the potential for significant performance improvements; however, the analysis of further radar and target scenarios is required before definitive conclusions can be drawn about the benefits of Coordinated RRM and about comparisons between Type 1 and Type 2 Management. The example in Section 6 utilised RRM techniques based on fuzzy logic prioritisation and the time-balancing scheduler. Independent RRM and Coordinated RRM based on other techniques, such as those presented in [2], should also be considered.

8   Acknowledgments

References

[1] B.W. Johnson and J.M. Green. Naval network-centric sensor resource management. In *7th International Command and Control Research and Technology Symposium (ICCRTS), www.dtic.mil*, 2002.

[2] Z. Ding. A survey of radar resource management algorithms. In *2008 Canadian Conference on Electrical and Computer Engineering (CCECE)*, pages 1559–1564, May 2008.

[3] S.L.C. Miranda, C.J.Baker, K. Woodbridge, and H.D. Griffiths. Fuzzy logic approach for prioritization of radar tasks and sectors of surveillance in multifunction radar. *IET Radar Sonar Navig.*, 1(2):131–141, 2007.

[4] M.T. Vine. Fuzzy logic in radar resource management. In *IEE Colloquium on Multifunction Radar and Sonar Sensor Management Techniques*, pages 1–4, 1998.

[5] S.P Noyes. Calculation of next time for track update in the mesar phased array radar. In *IEE Colloquium on Target Tracking and Data Fusion*, pages 2/1–2/7, 1998.

[6] G. Davidson. Cooperation between tracking and radar resource management. In *IET International Conference on Radar Systems*, pages 1–4, 2007.

[7] P.E. Berry and D.A.B. Fogg. On the use of entropy for optimal radar resource management and control. In *2003 Proceedings of the International Radar Conference*, pages 572–577, 2003.

[8] T. Kirubarajan, Y. Bar-Shalom, W.D. Blair, and G.A. Watson. IMMPDAF for radar management and tracking benchmark with ECM. *Aerospace and Electronic Systems, IEEE Transactions on*, 34(4):1115–1134, Oct 1998.

[9] G. Van Keuk and S.S. Blackman. On phased-array radar tracking and parameter control. *Aerospace and Electronic Systems, IEEE Transactions on*, 29(1):186–194, Jan 1993.

[10] Wolfgang Koch. On adaptive parameter control for phased-array tracking. In *Signal and Data Processing of Small Targets*, pages 444–455, 1999.

[11] J.M Butler. *Multi-function radar tracking and control.* PhD thesis, UCL University of London, 1998.

[12] A.J. Orman, C.N.Potts, A.K. Shahani, and A.R. Moore. Scheduling of tasks in phased array radar. *European Journal of Operational Research*, 90:13–25, 1996.

[13] A. Izquierdo-Fuente and J.R. Casar-Corredera. Optimal radar pulse scheduling using a neural network. In *IEEE Int. Conf. Neural Networks*, volume 7, pages 4558–4591, 1994.

[14] E. Winter and L. Lupinski. On scheduling the dwells of a multifunction radar. In *2006 International Conference on Radar*, pages 1–4, 2014.

[15] P.W. Moo. Scheduling for multifunction radar via two-slope benefit functions. *Radar, Sonar Navigation, IET*, 5(8):884 –894, Oct. 2011.

[16] M.I. Jimenez, L. del Val, J.J. Villacorta, A. Izquierdo, and M. Raboso Mateos. Design of task scheduling process for a multifunction radar. *Radar, Sonar Navigation, IET*, 6(5):341–347, June 2012.

[17] Ying He and E. K P Chong. Sensor scheduling for target tracking in sensor networks. In *43rd IEEE Conference on Decision and Control (CDC), 2004.*, volume 1, pages 743–748, Dec 2004.

[18] Ying He and E. K P Chong. Sensor scheduling for target tracking: A monte carlo sampling approach. *Digital Signal Processing*, 16:533–545, 2006.

[19] A. Charlish. Tasking networked multi-function radar systems for active tracking. In *Radar Symposium (IRS), 2013 14th International*, volume 1, pages 367–374, June 2013.

[20] A.S. Narykov and A. Yarovoy. Sensor selection algorithm for optimal management of the tracking capability in multisensor radar system. In *Radar Conference (EuRAD), 2013 European*, pages 499–502, Oct 2013.

[21] A.S. Narykov, O.A. Krasnov, and A. Yarovoy. Algorithm for resource management of multiple phased array radars for target tracking. In *Information Fusion (FUSION), 2013 16th International Conference on*, pages 1258–1264, July 2013.

[22] Y. Teng, H.D. Griffiths, C.J. Baker, and K. Woodbridge. Netted radar sensitivity and ambiguity. *Radar, Sonar Navigation, IET*, 1(6):479–486, Dec 2007.

[23] Chee-Yee Chong, Kuo-Chu Chang, and Shozo Mori. Distributed tracking in distributed sensor networks. In *American Control Conference, 1986*, pages 1863 –1868, June 1986.

[24] Kuo-Chu Chang, Chee-Yee Chong, and Y. Bar-Shalom. Joint probabilistic data association in distributed sensor networks. *Automatic Control, IEEE Transactions on*, 31(10):889 – 897, Oct 1986.

[25] G.W. Deley. A netting approach to automatic radar track initiation, association, and tracking in air surveillance systems. In G. Vankeuk, editor, *AGARD Strategies for Autom. Track Initiation 10 p (SEE N79-30454 21-32)*, Jun 1979.

[26] Y. Bar-Shalom. *Multitarget-multisensor tracking: advanced applications*. Artec House, Norwood, MA, 1990.

[27] D. Blades and S. Noyes. Practical use of siap metrics in the analysis of air picture quality. In *Target Tracking: Algorithms and Applications, 2006. The IEE Seminar on (Ref. No. 2006/11359)*, pages 29–38, 2006.

[28] S.L.C. Miranda, C.J.Baker, K. Woodbridge, and H.D. Griffiths. Comparison of scheduling algorithms for multifunction radar. *IET Radar Sonar Navig.*, 1(6):414–424, 2007.

[29] S. Lin and D.J. Costello. *Error Control Coding: Fundamentals and Applications*. Prentice-Hall, Englewood Cliffs, NJ, 1983.

[30] R. Helmick. *IMM estimator with nearest-neighbor joint probabilistic data association*, chapter 3. Artech House, 2000.