

Entrapment/Escorting and Patrolling Missions in Multi-Robot Cluster Space Control

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Abstract—The tasks of entrapping/escorting and patrolling around an autonomous target are presented making use of the multi-robot cluster space control approach. The cluster space control technique promotes simplified specification and monitoring of the motion of mobile multi-robot systems of limited size. Previous work has established the conceptual foundation of this approach and has experimentally verified and validated its use for 2-robot, 3-robot and 4-robot systems, with varying implementations ranging from automated trajectory control to human-in-the-loop piloting. In this publication, we show that the problem of entrapping/escorting/patrolling is trivial to define and manage from a cluster space perspective. Using a 3-robot experimental testbed, results are shown for the given tasks. We also revise the definition of the cluster space framework for a three-robot formation and incorporate a robot-level obstacle avoidance functionality.

Index Terms—cluster space, multi-robot systems, formation control, robot teams, escorting.

I. INTRODUCTION

Robotic systems offer many advantages to accomplishing a wide variety of tasks given their strength, speed, precision, repeatability, and ability to withstand extreme environments [1]. While most robots perform these tasks in an isolated manner, interest is growing in the use of tightly interacting multi-robot systems to improve performance in current applications and to enable new capabilities. Potential advantages of multi-robot systems include redundancy, increased coverage and throughput, flexible reconfigurability and spatially diverse functionality. For mobile systems, one of the key technical considerations is the technique used to coordinate the motions of the individual vehicles. A wide variety of techniques have been and continue to be explored. Behavioral methods [2], [3], [4] are based on designing a set of actions or behaviors for each element in the group such that desirable group behavior emerges as a result. Another approach makes use of potential fields to represent the desired formation pattern and trajectory [5]. An alternative method uses leader-follower patterns [6], [7]. A variant of this is leader-follower chains, in which follower robots control their position relative to one or more local leaders which, in turn, are following

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other local leaders in a network that ultimately are led by a designated leader [8].

Despite the wide range of multi-robot coordination methods, to our knowledge only one paper explicitly addressed the escort/entrapment task [9]. Our work explores this issue using the cluster space control method, a specific centralized approach for robot clusters of limited size (on the order of ones to tens) and locale (such that global communication is available).

The motivation of the cluster space [1] approach is to promote the simple specification and monitoring of the motion of a mobile multi-robot system. This strategy conceptualizes the n-robot system as a single entity, a cluster, and desired motions are specified as a function of cluster attributes, such as position, orientation, and geometry. These attributes guide the selection of a set of independent system state variables suitable for specification, control, and monitoring. These state variables form the system's cluster space. Cluster space state variables may be related to robot-specific state variables, actuator state variables, etc. through a formal set of kinematic transforms. These transforms allow cluster commands to be converted to robot-specific commands, and for sensed robot-specific state data to be converted to cluster space state data. As a result, a supervisory operator or real-time pilot can specify and monitor system motion from the cluster perspective. Our hypothesis is that such interaction enhances usability by offering a level of control abstraction above the robot- and actuator-specific implementation details.

Previous work presented a generalized framework for developing the cluster space approach for a system of n robots, each with m degrees of freedom (DOF)[1]. This framework was successfully demonstrated for both holonomic and non-holonomic two-robot systems, including several cluster-space-based versions of regulated motion [10], automated trajectory control [11], [12], human-in-the-loop piloting [13], [14], and potential field-based obstacle avoidance [15]. The method was also implemented for three-robot [16] and four-robot [17] non-holonomic planar systems, as well as two- and three-robot surface ship [18] and aerial systems [19], [20].

In this publication, we show that the problem of entrapping/escorting/patrolling is trivial to define and manage from a cluster space perspective. Using a 3-robot experimental testbed, results are shown for such tasks. Additionally, a robot-level obstacle avoidance functionality is added in order to prevent collisions between the robots and the tracked target.

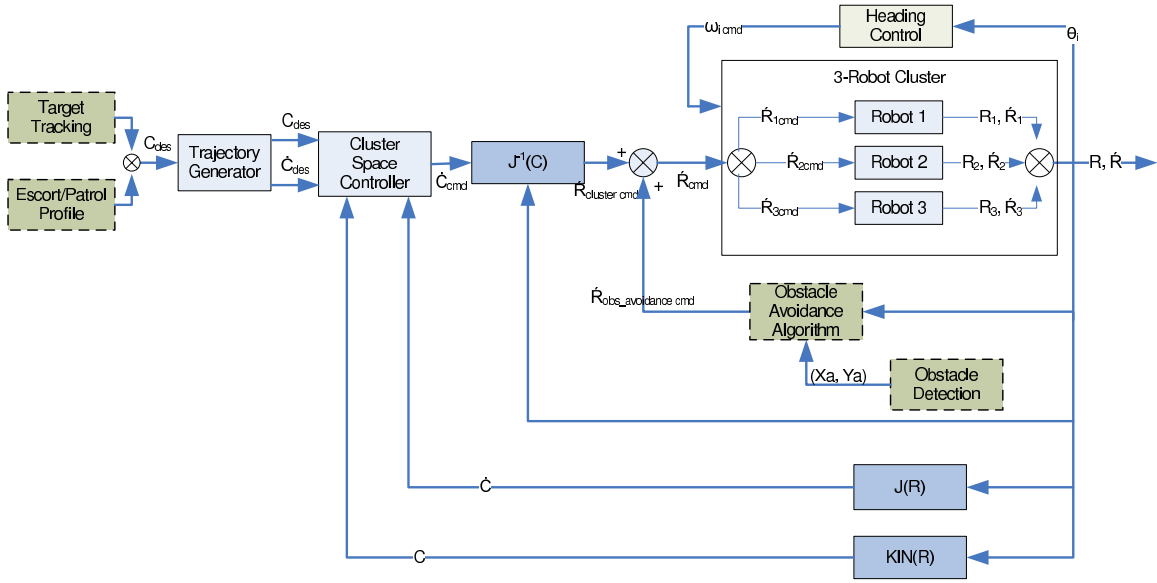


Fig. 2. Cluster Space Control Architecture for a Mobile Three-Robot System. In this cluster space control architecture, desired motions and control actions are computed in the cluster space; control actions are converted to the robot space through the use of the inverse Jacobian relationship and combined with control actions from the Obstacle Avoidance algorithm.

where

$$J^{-1}(\vec{C}) = \begin{pmatrix} \frac{\partial r_1}{\partial c_1} & \frac{\partial r_1}{\partial c_2} & \dots & \frac{\partial r_1}{\partial c_9} \\ \frac{\partial r_2}{\partial c_1} & \frac{\partial r_2}{\partial c_2} & \dots & \frac{\partial r_2}{\partial c_9} \\ \vdots & \vdots & \ddots & \vdots \\ \frac{\partial r_3}{\partial c_1} & \frac{\partial r_3}{\partial c_2} & \dots & \frac{\partial r_3}{\partial c_9} \end{pmatrix}. \quad (26)$$

Due to limited space, the full algebraic expressions for $J(\vec{R})$ and $J^{-1}(\vec{C})$ are not included. It can be verified that $J(\vec{R}) * J^{-1}(\vec{C}) = I_{(9 \times 9)}$.

C. Control Framework

Fig. 2 presents the control architecture for trajectory-based cluster space control of the experimental three-robot system. A cluster level PID controller compares cluster position and velocity with desired trajectory values and outputs cluster commanded velocities, which are translated into individual robot velocities through the inverse Jacobian. State data from the robots are converted to cluster space information through the forward kinematics and Jacobian and fed back into the controller to close the loop.

The non-holonomic constraints given by the differential-drive motion of the robots effectively reduce the number of independently specified cluster pose variables to six. As a consequence, inner-loop robot-level heading control is implemented on each robot and the cluster space controller does not regulate the three cluster parameters corresponding to yaw orientation of the robots relative to the cluster, specifically ϕ_i .

The architecture of Fig. 2 differs from that presented in previous work [16] in two aspects, each of which is indicated in the diagram with dotted lines. First, the trajectory generator is fed by two new functions that are used to specify the desired cluster space variable trajectory. The first is a target

tracking function that measures the target's position; this information is typically used to specify the centroid location for the cluster. The second is an escort/patrol profile manager that specifies the desired values for the remaining cluster variables based on the manner in which the escort/patrol function should be implemented. This is explained in Section III-A. The second change to the control architecture is the inclusion of obstacle avoidance functions. The position of the obstacle is tracked, and an algorithm produces avoidance velocities that are combined with commanded velocities from the inverse jacobian function. The avoidance algorithm is described in Section III-B.

TABLE I
ESCORTING MISSION DEFINITION IN TERMS OF CLUSTER PARAMETERS

Cluster Parameters	Mission		
	Escorting	Patrolling	Oriented Escorting
Centroid (x_c, y_c)	at Target	at Target	at Target
Orientation (θ_c)	Constant	$\omega \cdot t$	$Atan2(V_y, V_x)$
Shape (p, q, β)	Constant	Constant	Constant

III. THE ESCORTING MISSION

The mission of escorting can be seen as the task of surrounding and maintaining a formation around a target whose movement is not known *a priori* but can be measured in real-time [9]. As the target moves, the formation moves to keep the target at its centroid, maintains the distance from the formation vehicles to the target, and evenly distributes the formation vehicles around the target. An oriented escorting task can be considered to be escorting when the orientation of the formation is aligned with the direction of motion of the target. The patrolling task can be defined as a further extension where the formation rotates around the target for surveillance purposes. In the literature, this is defined as a

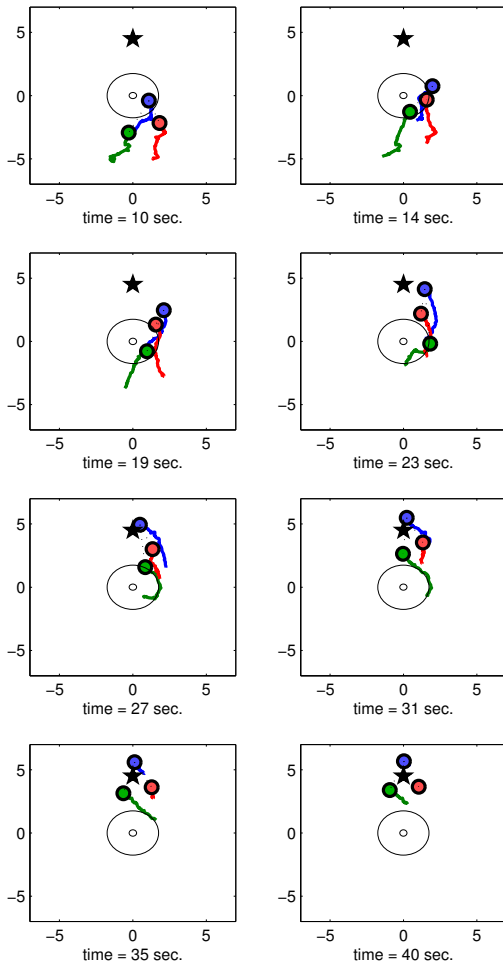


Fig. 3. Test results showing a 3-robot cluster (colored circles) negotiating an obstacle -at (0,0)- while getting to its desired final position (star). The detection and avoidance regions are shown as concentric circles. As the formation moves and the robots get inside the obstacle detection region, the potential field comes into play. The axes represent global x and y coordinates in meters.

multi-agent cyclic patrolling strategy [22], where the nodes of the path are the initial positions of the robots relative to the target.

Entrapment may be specified similarly. In fact, from a motion control point of view, it may be implemented in precisely the same way as the escorting task, although the purpose would be to reduce target escape windows rather than preventing intrusion by external agents.

A. Escorting/Patrolling in Cluster Space Control

The cluster control approach is a natural way of specifying the escorting/patrolling problem: the cluster centroid tracks the target as the shape of the cluster specifies the platoon distribution around it. This approach also allows for simple specification of the patrolling task. This can be achieved by

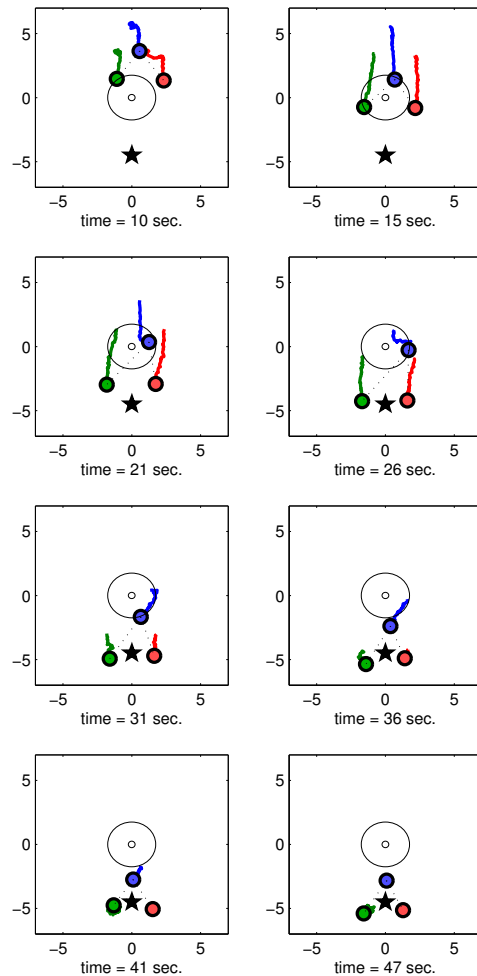


Fig. 4. Test results showing a 3-robot cluster (colored circles) negotiating an obstacle -at (0,0)- while getting to its desired final position (star). The detection and avoidance regions are shown as concentric circles. This time, robot 2 (green) goes past the obstacle by the left while robots 1 and 3 go past it by the right. The axes represent global x and y coordinates in meters.

simply varying the cluster orientation parameter θ_c which results in the rotating motion of the robots around the cluster centroid. In the same way, specifying the desired cluster orientation as a function of the target velocity defines the required behavior of the oriented escorting task. Table I shows the cluster parameter specifications that meet the requirements for the different missions.

B. Obstacle Avoidance

An additional feature required for this task is obstacle avoidance. The robots must not collide with the target at any time. To prevent this from happening, a robot-level avoidance function is implemented. Given the robot i position (x_i, y_i) , the obstacle position (x_a, y_a) and the distance function

$$d_{ai} = \sqrt{\left(\frac{x_i - x_a}{\nu}\right)^2 + \left(\frac{y_i - y_a}{\xi}\right)^2}, \quad (27)$$

where $\nu, \xi > 0$, the avoidance potential function implemented [23], [24], [25] is:

$$V_{ai} = \left(\min \left\{ 0, \frac{d_{ai}^2 - R^2}{d_{ai}^2 - r^2} \right\} \right)^2, \quad (28)$$

where $R > r > 0$. R and r are the radii of detection and avoidance regions, respectively. This function is infinite at the boundary of the avoidance region and zero outside the detection region. To break the symmetry when it occurs, different shapes of the potential function, for example ellipsoids, can be obtained by choosing different values for the coefficients ν, ξ . The partial derivatives of V_a with respect to x and y are used to command the robots away from the obstacle. The combined robot-level velocity commands for robot i in global coordinates are then

$$\dot{x}_{i \text{ cmd}} = \dot{x}_{i \text{ cluster}} + k_{ax} \frac{\partial V_{ai}}{\partial x}, \quad (29)$$

and

$$\dot{y}_{i \text{ cmd}} = \dot{y}_{i \text{ cluster}} + k_{ay} \frac{\partial V_{ai}}{\partial y}, \quad (30)$$

where $(\dot{x}_{i \text{ cluster}}, \dot{y}_{i \text{ cluster}})$ are the commanded velocities for robot i given by the inverse jacobian output and (k_{ax}, k_{ay}) are the obstacle avoidance control gains.

To demonstrate the functionality of the obstacle avoidance algorithm, experiments where an obstacle is in the path of the formation are conducted. Fig. 3 and Fig. 4 show test results using the testbed described in section IV-A. The formation shape is momentarily altered while the robots negotiate the obstacle but it is recovered after that. For these tests, robots are not considered to be obstacles to the other robots and it is assumed that the formation controller keeps the robots from colliding with each other.

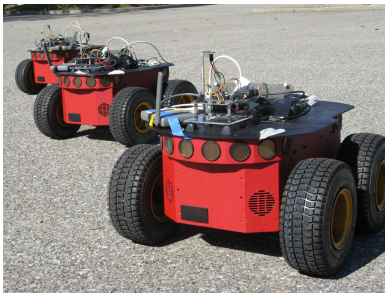


Fig. 5. Pioneer Robots from MobileRobots Inc. with custom sensor and communication suites.

IV. EXPERIMENTS

In this section, a brief description of the testbed utilized followed by results of the execution of an escorting mission and a patrolling mission are presented.

A. Testbed

Experimental tests were conducted using four differential drive robots with custom sensor suites based on Ultra-Wide Band (UWB) tracking technology [16]. Onboard radio-modems relay robot state information to a central computer that executes the control algorithms and transmits back velocity commands. One of the robots is in this case the target unit, which follows a predefined trajectory that is unknown to the cluster. The position of the target is then used as the input to the 3-robot cluster x_c and y_c parameters. Fig. 5 shows the robots used in these experiments with their sensor and communication suites.

B. Results

The first result is from an escorting mission where the target follows a straight path. The formation centroid tracks the target and the robots in the formation keep a relative distance of 2 meters. Fig. 6 shows the position of the target and escorting robots at different points in time. In the first frame the cluster robots get in position around the target avoiding any collisions with it, then the target and the formation start moving. After 200 seconds the target stops and the formation stays in position around it. The tracking mean square errors (difference between target and cluster centroid positions) in x and y , after the initial transients are over, are 0.027 meters and 0.063 meters, respectively.

The second mission is the patrolling task. This time, the target again follows a rectilinear trajectory but the formation rotates around the target keeping the relative distances. This is achieved simply by defining a linear trajectory for the cluster orientation parameter θ_c . Fig. 7 shows the motion of the individual robots resulting from this specification. Again, the robots get to their position and start tracking the target while patrolling around it. The tracking mean square errors (difference between target and cluster centroid positions) in x and y , after the initial transients are over, are 0.023 meters and 0.013 meters, respectively.

In order to show the effects of the presence of an obstacle in the vicinities of the formation, Fig. 8 shows an escorting mission that tracks the target while avoiding an obstacle. When a robot detects the obstacle, it drives around modifying momentarily the cluster shape.

V. DISCUSSION

The cluster space control has so far been used as a centralized approach. This type of architecture has its benefits and drawbacks. The centralized approach allows for a full specification and supervision of the formation. For example, the location of each particular robot in the cluster can be decided, allowing for tasks where each robot has a particular capability and certain roles must be taken by specific robots. The drawback of this approach is that global communication is required to control the formation. We believe that this is a valid assumption in many situations where the workspace is relatively small. In such cases, a centralized approach makes better use of the available information than a distributed approach. Due to communication channel

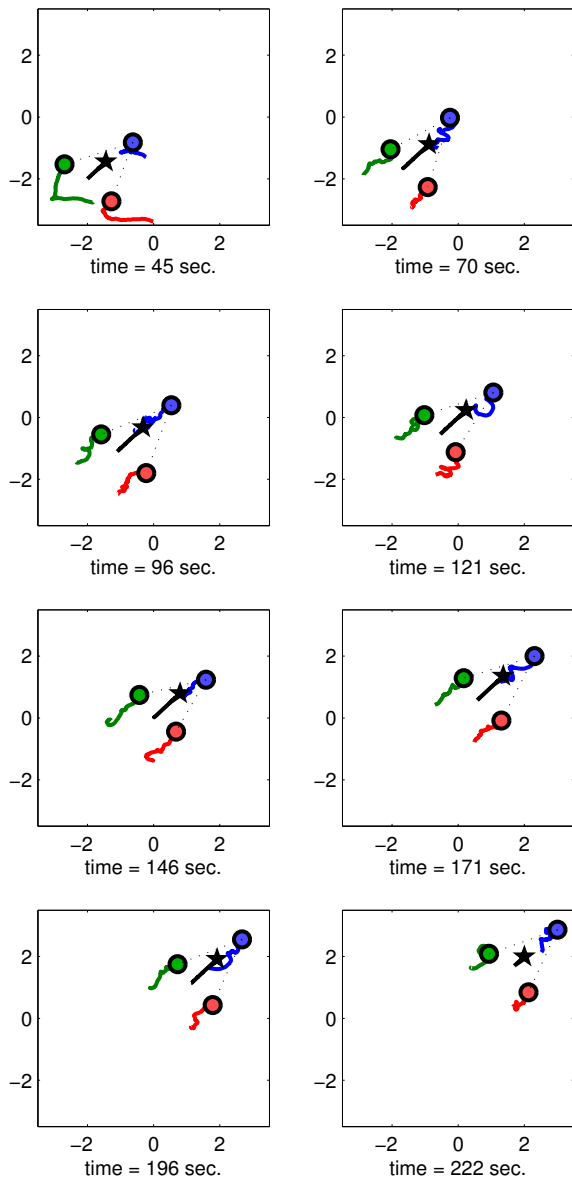


Fig. 6. Escorting test results using the multi-robot testbed showing a 3-robot cluster (circles) following the target (star) while maintaining the triangular formation. The axes represent global x and y coordinates in meters.

capacity or environmental interferences this may not always be the case. We acknowledge that this approach should be complemented with decentralized strategies in order to deal with such situations. Furthermore, we are currently working on variations of the cluster space approach in order for it to operate in a distributed fashion.

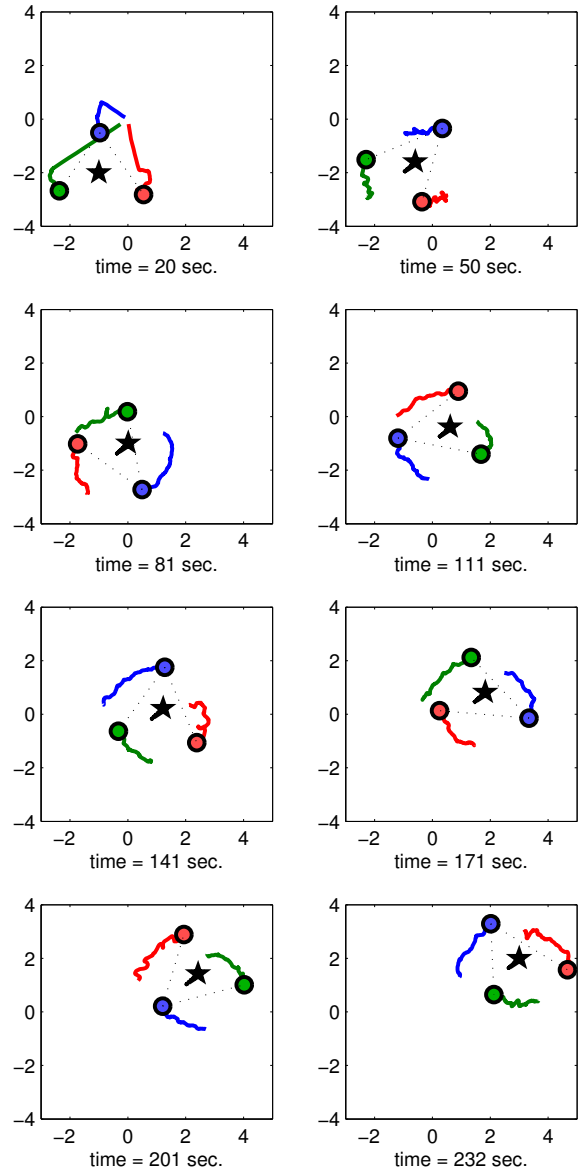


Fig. 7. Patrolling mission results using the multi-robot testbed showing a 3-robot cluster (circles) following the target (star) while rotating around it (patrolling) and maintaining the triangular formation. The robots get in formation around the target (time=20s) and then start tracking it. The trails show the resulting robot motions of the patrolling while escorting task. The axes represent global x and y coordinates in meters.

VI. FUTURE WORK AND CONCLUSIONS

Ongoing work includes the study of alternative cluster definitions under the assumption that they may be more convenient for specifying and monitoring requirements for different missions. Upgrading the obstacle avoidance algorithm to deal with multiple obstacles is also under study. A new vision-based multi-robot testbed is being developed

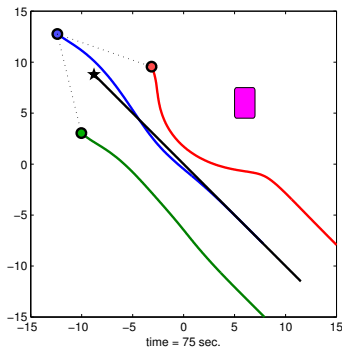


Fig. 8. Escorting mission showing a 3-robot cluster (circles) following the target (star) while avoiding the obstacle (square). The trails show the resulting robot motions. The axes represent global x and y coordinates in meters.

which will allow for more accurate position measurements as well as faster loop rates. A formal stability analysis of the cluster control architecture is currently being developed.

The tasks of escorting and patrolling around a moving target were addressed in the context of cluster space control. The problem was specified in terms of simple cluster parameter trajectories resulting in complex robot motions that satisfied the required formation behavior. An obstacle avoidance algorithm based on potential field techniques was implemented at the robot level to prevent collisions between the formation robots and the target. Experiments using an UWB-based multi-robot testbed demonstrated the functionality of the proposed obstacle avoidance approach. The testbed was then used to execute successfully an escorting mission where the robots stay in formation around a moving target and a patrolling mission where the robot formation rotates around the moving target. A simple specification of the tasks in cluster space produced complex robot-level behaviors that achieved the proposed missions.

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