Preprint: Modeling and Simulation of a Multi-Robot System Architecture; Ahmed R. Sadik, Christian Goerick, Manuel Muehlig; 2019

This is an accepted article published in 2019 International Conference on Mechatronics, Robotics and Systems Engineering (MoRSE). The final authenticated version is available online

at: https://ieeexplore.ieee.org/document/8998662

DOI 10.1109/MoRSE48060.2019.8998662 ©2019 IEEE

Copyright notice: ©2019IEEE. Personal use of this material is permitted. Permission from IEEE must be obtained for all other uses, in any current or future media, including reprinting/republishing this material for advertising or promotional purposes, creating new collective works, for resale or redistribution to servers or lists, or reuse of any copyrighted component of this work in other works.

Modeling and Simulation of a Multi-Robot System Architecture

Ahmed R. Sadik Honda Research Institute Europe Offenbach am Main, Germany ahmed.sadik@honda-ri.de Christian Goerick Honda Research Insitute Europe Offenbach am Main, Germany christian.goerick@honda-ri.de Manuel Muehlig Honda Research Insitute Europe Offenbach am Main, Germany manuel.muehlig@honda-ri.de

Abstract— A Multi-Robot System (MRS) is the infrastructure of an intelligent cyber-physical system, where the robots understand the need of the human, and hence cooperate together to fulfill this need. Modeling the MRS is a crucial aspect of designing the proper system architecture, because this model can be used to simulate and measure the performance of the proposed architecture. However, an MRS architecture modeling is a very difficult problem, as it contains many dependent behaviors that dynamically change due to the current state of the system. In this paper, we introduce a general-purpose MRS case study, where the humans initiate requests that are achieved by the available robots. These requests require different plans that use the current capabilities of the available robots. After proposing an architecture that defines the solution components, three steps are followed. Firstly, modeling these components via a proper Architecture Description Language (ADL). Business Process Model and Notation (BPMN) is used as an ADL to represent the behaviors of every component, which is an essential need to model the solution. Secondly, simulating these components behaviors and interaction in form of software agents. Java Agent DEvelopment (JADE) middleware is used to develop the proposed model. JADE is based on a reactive agent approach, therefore it can simulate the dynamically interaction among the solution components. Finally, analyze the performance of the solution by defining a number of quantitative measurements, which can be obtained while simulating the system model, therefore the solution can be analyzed and compared to another architecture.

Keywords— Multi-Robot System Architecture, Model-based System Engineering, Multi-Agent Simulation, Distributed System Performance

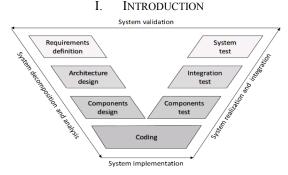


Fig. 1. simplified version of the V-model - adapted from [3]

A Multi-Robot System (MRS) is an intelligent solution for complex problems that need more than a single robot with all the required capabilities to solve this problem [1]. The MRS has gained a great focus in research since the nineties. Now, the MRS is mature enough to be one of the core technologies of Industry 4.0, and cyber-physical system. Many applications

of MRS can be seen in unmanned aerial vehicles, multi-robot surveillance, search and rescue missions, services robots in smart homes and warehouses [2]. The advantages of an MRS is the time and effort efficiency, reliability and robustness. However, the problem with the MRS is its complexity. Thus, modeling and simulation of an MRS is an essential necessity to avoid this complexity. An MRS is an important example of a complex system within the scope of the system engineering field [3]. The International Council On System Engineering (INCOSE) defines the V-Model as a necessary procedure to develop a complex system. Fig. 1 is a simplified version of the V-Model that fits the MRS development. The left side of the model focuses on the system decomposition and analysis, where the MRS architecture is built upon the system requirements. Afterwards, the system is divided into components that are modeled in details to be coded and integrated. Ultimately, during the system validation, the system is evaluated over the different design levels. Following the V-model roadmap, this article proposes an approach to model, simulate, and evaluate the performance of an MRS.

As the MRS has many different applications, section II of the paper will describe a specific case study that can be used to define the system requirements. Section III introduces the fundamentals that are required to model, simulate, and evaluate the performance of the case study. Modeling the case study is explained in details in section IV, while its simulation is shown in section V. Thus, the system performance can be analyzed in section VI. Finally, section VII summarizes and discusses the work and introduces the future research.

II. PROBLEM AND CASE STUDY DESCRIPTION

An MRS can be seen as an Information System (IS). An IS architecture is the practice of IS designing, by defining the set of required components, their structure, behaviors, and the relations and interaction among these components [4]. An IS architecture is an abstract overall depiction of the system that reflects its functions, and constrains [5]. Therefore, it provides a graspable mean to reason and enhance the system properties and requirements, and blueprints that distinguish the system concept from its implementation technology [6]. An IS performance is an important feature to evaluate the system architecture. However, there are no clear definitions for quantitative performance criteria that can be measured during the MRS runtime, and hence can be used to analyze the overall system behavior. Therefore, the problem of this article is to provide an approach to model, simulate and evaluate the performance of an MRS architecture.

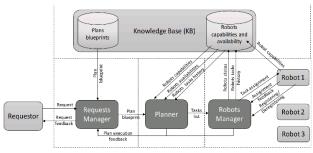


Fig. 2. case study component diagram

The MRS involves a variety of other research topics such as planning and scheduling [7], knowledge representation [8], and reasoning [9]. The proposed MRS architecture uses the most simplified method to model these aspects, without influencing the main system functions and processes. The case study of this research is shown in Fig. 2. The proposed architecture is built upon the component-based architectural pattern, which is a common pattern for a multi-tier complex system [10]. The main components define this architecture are the requests manager, the planner, and the robots manager. The requests manager receives a request (Rq) from a requestor, which can be a human or a software application. The requests manager checks if the Knowledge Base (KB) contains a plan blueprint (Pb) that can fulfill the current request. A plan blueprint is a sequence of tasks (T), i.e., $Pb_i =$ $\{T_1,...,T_n\}$, where n is the number of tasks in this blueprint and can be different from one blueprint to another. A task is a function of the capabilities (C) of the robot (R), i.e., $T_i = f(C_x, T_i)$ C_{v} ,...), where every robot has a different set of capabilities. If the requests manager found an equivalent plan blueprint to a specific request, it forwards it to the planner. The planner checks which robots are available, and then checks if the available robots have the capabilities to achieve the tasks in the plan blueprint. If more than one robot have the capabilities to achieve a specific task, the planner compares the number of tasks that have been done by these robots in the past. Upon this comparison, the planner decides which robot will be assigned for this task. If the planner matches all the tasks of the plan blueprint with the available robots, it sends a verified plan (P) to the robots manager. The robots manager assigns the tasks of the verified plan to the robots and get the task execution feedback.

In the previous scenario, three types of variations are considered during the system runtime. First is the change in the plans blueprint, by adding a new plan blueprint, deleting an existing blueprint, or modifying an existing plan blueprint. The second source of variation is the number of the available robots. This case study considered a maximum number of three robots that can exist at the time. The robots need to register to or deregister from the MRS via the robots manager. The final source of variation is the capabilities of the robots. In case of updating or modifying the robot capabilities, the robot must deregister from the MRS. Then when it registers itself again, it updates its capabilities in the KB.

III. SOLUTION FUNDAMENTALS

A. Business Process Model and Notation

Business Process Model and Notation (BPMN) is an Architecture Description Language (ADL) that extends the Unified Modeling Language (UML). UML overcomes the informality of box-and-line languages [11], and the lack of mature tools of the other formal ADLs [12]. UML introduces a standard set of diagrams to visualize the different aspects and behaviors of the system. One of the most important UML diagrams is the activity diagram, which constructs a process model via standard visualization elements [13].

TABLE I. BPMN notations that are used in modeling the case study $\left[15\right]$

Name	Туре	Notations	Description	
Activity (a routine or a task that happens during the process)	standard activity		an activity that performs a general task or routine	
	send message activity		an activity that performance a task and then send a message to start another activity in another process	
	receive message activity		an activity that starts due to receiving a massage from another activity	
Event (a happening that triggers an activity or results due to an activity)	standard start	\bigcirc	an event that starts an activity at the very beginning of the process	
	standard intermediate	\bigcirc	an event that starts an activity during the process	
	standard end	0	an event that ends an activity at the end of the process	
	catch message start		a received message event that starts an activity at the very beginning of the process	
	catch message intermediate	Ø	a received message event that starts an activity during the process	
	throw message intermediate		a sent message event that happens due to an activity during the process	
	throw message end		a sent message event that happens due to an activity at the end of the process	
	catch signal start		a signal event that starts an activity at the very beginning of the process	
	catch signal intermediate		a signal event that starts an activity during the process	
	throw signal end	۲	a signal event that happens due to an activity at the end of the process	
	start timer	٢	a timer event that starts at the very beginning of the process	
	Intermediate timer	Ø	a timer event that starts during the process	
Flow	sequential	\longrightarrow	a sequential execution path of flow of activities	
(the flow order of activities)	default	$\rightarrow \rightarrow$	a default path of flow in case all the other paths are false	
Gateway (a logic gate that controls the flow of activities)	exclusive OR merge		when any of the ingoing paths is true, it sets the outgoing path to be true	
	exclusive OR split		when the ingoing path is true, it sets only one of the outgoing paths to be true	
	inclusive OR merge	→	when more than one active paths are true, it sets the outgoing path to be true	
	inclusive OR split	$\rightarrow \phi$	when the ingoing path is true, it sets one or more of the outgoing paths to be true	
	parallel AND merge		when all the ingoing paths are true, it set the outgoing path to be true	
	parallel AND split		when the ingoing path is true, it sets all the outgoing paths to be true	

However, UML activity diagram can only describe a highlevel abstract model of the process. This is because of two problems. First, UML does not consider the logical flow of execution among the activities. Second, UML notations are very limited in number and meaning. Those problems reduce the overall understandability of a UML activity diagram. Accordingly, the UML activity diagram fails to provide an analytical model that can be used later by the developer as a guide during the implementation phase. The problems in UML have been solved in the BPMN language [14]. BPMN provides the concept of control gateways. Therefore, it can precisely describe the logical follow of the activities within the process. Furthermore, BPMN provides rich set of notations, every notation has a predefined semantic, that accurately defines the meaning of this notation, this semantic is governed by a known syntax in case of combining two or more notations together. Table 1 summarizes and explains the meaning of the important BPMN notations that have been used to construct an analytical model of the proposed case study architecture.

B. Java Agent Development Framework

Java Agent DEvelopment (JADE) is a distributed middleware that is used to implement a Multi-Agent System (MAS) [16]. Fig. 3-a shows the deployment of the proposed

MRS architecture via JADE Remote Monitoring Agent (RMA). Every component in the proposed architecture is represented as JADE software agent. Each JADE runtime instance is an independent thread that composes of a set of containers. A container is a group of agents run under the same runtime instance. Every runtime instance must have a main container with an Agent Management System (AMS) and a Directory Facilitator (DF). An AMS provides a unique Identifier (AID) that is used as a communication address for every agent. While, the DF announces the services that agents can offer. JADE complies with the Foundation for Intelligent Physical Agent (FIPA) specifications. FIPA is an IEEE Computer Society standards organization that promotes agentbased technology and the interoperability of its standards with other technologies. JADE agent uses FIPA-Agent Communication Language (FIPA-ACL) to exchange messages either inside or outside their runtime instance [17].

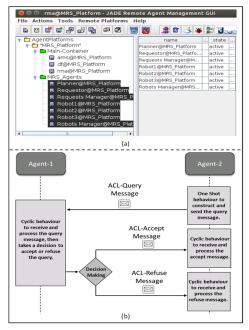


Fig. 3. (a) JADE framework - (b) JADE interaction diagram - an example

Every JADE agent applies a group of behaviors. A behavior is an event handler routine that is used by the agent to modify its parameters and negotiate with other agents as shown in Fig. 3-b. JADE offers different types of behaviors, four of those behaviors have been used during the implementation of this work, which are the following:

- One-shot behavior: a simple behavior that is executed once when it is called by the agent. Thus, it is useful to trigger an event and to send an ACL-Message.
- Cyclic behavior: a simple behavior that stays active as long as the agent is alive. Thus, it is so useful to receive a message with specific conversation-ID.
- Sequential behavior: a composite behavior that controls the sequence of execution of more than one-shot behavior. The sequence control is not always based on a fixed order, as it can be based on the sum of the input events from the agent environment.

• Parallel behavior: a composite behavior that concurrently controls the execution and the termination of more than one-shot behavior.

From the previous description of JADE framework, it can be seen that JADE is a proper tool to implement a BPMN model in the context of MRS. This is because of two reasons. First, an analogy between BPMN and JADE concepts can be easily derived. An activity from the BPMN model can be coded as a simple one-shot or cyclic behavior in JADE. While, a gateway can be translated into a composite sequential or parallel behavior in JADE. Second, JADE implementation can be used as a simulator of the MRS, to test the different aspects of the system, the same way it is used in this article. Furthermore, the same implementation code can be used to deploy the system over real world hardware [18].

C. Performance measurements

Measuring the MRS performance is a necessity to evaluate the system. The related researches in [19] [20] propose criteria such as distributability, diagnosability, modifiability, and modularity. However, these qualitative criteria are often relative and vague [21]. Thus, this article specifies absolute quantitative indicators and measures them during the runtime to evaluate the MRS performance. By thinking in the MRS as a black box that receives a number of requests, which either success or fail to be executed. The system performance can be expressed as a function in the following measurements:

- Throughput: the number of processed (successful and fail) requests per time unit.
- Latency: the time taken from the arrival of a request to the start of executing this request (shorter latency means better performance).
- Success rate: the number of successful requests divided by the number of received requests per time unit.
- Failure rate: the number of failed requests divided by the number of received requests per time unit.
- Efficiency: the success rate divided by the failure rate.

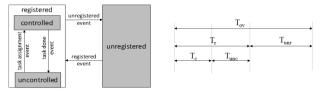


Fig. 4. robot state diagram

As the robots performance has a great influence on the MRS performance [22], it will be considered by this reach as well. The state diagram in Fig. 4 shows the different states that a robot can go through during its operation. Based on this diagram the following measurements can be obtained:

- Controlled time (T_c): the time taken by the robot to perform a task.
- Uncontrolled time (T_{unc}): the time that the robot is registered and waiting to be assigned for a task.
- Registered time (T_r): the summation of the robot controlled and uncontrolled time.

- Unregistered time (T_{unr}): the time that the robot is unregistered from the MRS.
- Overall time (T_{ov}): the summation of the robot registered and unregistered time.

Based on the above measurements, the following robot performance criteria can be calculated:

- Availability: the robot registered time (T_r) with respect to its overall time (T_{ov}).
- Utilization: the robot controlled time (T_c) with respect to its overall time (T_{ov}).
- Effectiveness: the robot controlled time (T_c) with respect to its uncontrolled time (T_{unc}).

IV. SYSTEM MODEL

A. Request Manager

The main responsibility of the requests manager is to receive the requests from different requestors, then find if there is an associated plan blueprint with this request in the KB, to send it to the planner for further processing Fig. 5 shows the requests manager model as a BPMN activity diagram. In this diagram, the requests manager receives a request at the very beginning or during the process, and places it at the bottom of the request list. Then, it checks if there is another plan that has been sent for execution. If yes, the requests manager waits the plan execution feedback. If no, the requests manager selects the request at the top of the requests list to be processed. In this scenario, it has been assumed that the requests manager is scheduling the requests based on First Come First Serve (FCFS) method.

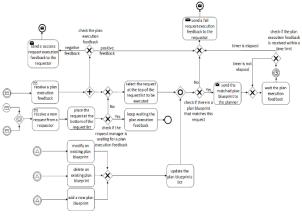


Fig. 5. requests manager activity diagram

The requests manager checks if the selected request matches any of the plan blueprints in the KB. Concurrently, the requests manager can add, delete, or modify the plan blueprints. Consequently, the requests manager handles any change in the plan blueprints during matching them with the selected request. If the requests manager does not find a plan blueprint match with the selected request, it sends a fail request execution to the requestor. If there is a match between one of the existing plan blueprints and the selected request, the requests manager sends the plan blueprint to the planner and initiates a time limit to receive a plan execution feedback. If the feedback is not received within this time limit, the requests manager considers this request is failed to be accomplished, and moves to the next request in the list. If the feedback is received within the time limit, the requests manager checks if this feedback is positive or negative, and sends a request success or fail response upon that.

B. Planner

The main responsibility of the planner is to receive a plan blueprint from the requests manager and checks if it can be transformed to a verified executable plan, by using the available robots. Fig. 6 shows the planner model as a BPMN activity diagram. In this diagram, when the planner receives a plan blueprint, it retrieves the current availability of the robots, their current capabilities, and their tasks history. Then it checks the number of registered robots. If it finds only one robot is available, it directly sends a fail plan execution to the requests manager, as it is known in advance that the plan needs more than one robot to be executed.

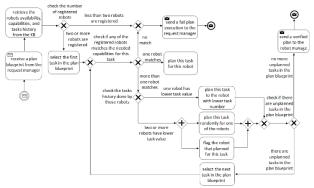


Fig. 6. planner activity diagram

If more than one robot is registered, the planner selects the first task in the plan blueprint, and compares it to the capabilities of the registered robot. If no robot matches with the capabilities that are needed to execute this task, the planner sends a fail plan execution to the requests manager. If one robot only matches, this robot will be planned to execute this task. Otherwise, if there are more than one robot that can perform this task, the planner tries to balance the tasks distribution among these robots. This is done by checking the tasks history of these robots, and then it plans this task for the robot with the lowest tasks history. Finally, if there are two or more robots with lowest tasks history, the planner plans the task for any of them randomly. Then it marks this robot, as if this case happens again, another robot will be planned for the task. After the planner plans a task for a specific robot, it goes through all the remaining tasks in the received plan blueprint, and performs the previously described algorithm. If all the tasks in the plan blueprint are planned. The planner sends this verified plan to the robots manager for execution.

C. Robots Manager

The main responsibility of the robots manager is to receive a verified plan from the planner and assign the tasks in this plan to the registered robots. Fig. 7 shows the robots manager model as a BPMN activity diagram. In this diagram, the robots manager receives the verified plan. Simultaneously, the robots manager is responsible for registering/unregistering the robots to/from the MRS. Consequently, the robots manager can handle any change in the robots availability during assigning the tasks in the plan. The robots manager assigns the first task in the plan to the associated robot for execution. Then, it initializes a time limit to receive a task execution feedback. If

the feedback is not received within that time limit, the robots manager considers this plan as failed, and sends a plan execution fail feedback to the requests manager. If the feedback is received within the time limit, the robots manager checks if this feedback is positive or negative.

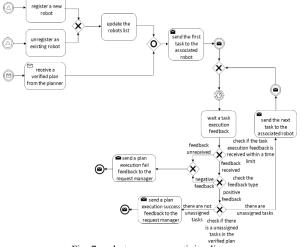
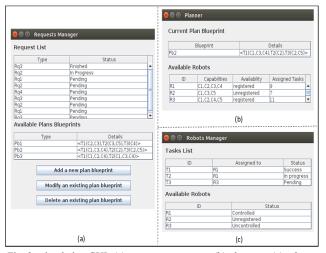


Fig. 7. robots manager activity diagram

If the feedback is negative, the robots manager considers this plan is failed, and sends a plan execution fail feedback to the requests manager. If the feedback is positive, the robots manager checks if there are remaining unassigned tasks in the verified plan. If so, it goes through them one by one, and performs the previously described algorithm. Finally, if all the tasks in the verified plan have been successfully executed, the robots manager sends a plan execution success feedback to the requests manager.



V. SYSTEM SIMULATION

Fig. 8. simulation GUIs (a) requests manager – (b) planner – (c) robots manager

JADE is used to deploy the proposed MRS architecture. Each of the activity diagrams that discussed earlier is implemented as a JADE agent with a separate Graphical User Interface (GUI) as shown in Fig. 8. These GUIs are used to manipulate and monitor the agents (i.e., system components) parameters. Fig. 8-a shows the requests manager GUI that is used to add/remove/modify the plan blueprints, while the requests manager processes the requests. Fig. 8-b shows the planner GUI that is used to show the executed plan blueprint. Also, it shows the available robots and their status, capabilities, and tasks history. Fig. 8-c shows the robot manager GUI that is used to show the assigned tasks for the available robots.

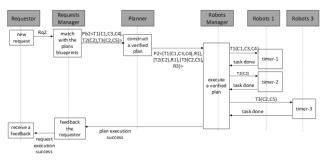


Fig. 9. plan execution sequence diagram – an example

Fig. 9 is an example of the interaction among JADE agents to fulfil a request, while Fig. 10 shows the ACL-messages that are generated during this interaction. The example explains the execution of request (Rq₂) that can be seen in the requests manager GUI in Fig. 10-a. The interaction starts when Rq₂ status is in progress. Rq₂ has matched a plan blueprint (Pb₂). The requests manager sends the contents of the plan blueprint to the planner in an ACL-massage as shown in Fig. 10-a. The planner constructs a verified plan (P₂) by distributing the tasks over the available robots based on their capabilities and tasks history. At this time, only two robots are registered which are R₁ and R₃. R₁ has done 9 tasks in its task history, while R₃ has done 11 tasks in its task history, as shown in Fig. 10-b.

		8 ACL Message		
		ACLMessage Envelope		
		Sender: Vi Planner@MRS_Platform		
		Receivers: Robots Manager@MRS_Platform		
		Communicativ agree		
ACL Messag		Content:		
ACL Message	Envelope	{T1(C1,C3,C4),R1},{T2(C2),R1},{T3(C2,C5),R3}>		
Sender:	Vi Requests Manager@MRS_F			
	Planner@MRS_Platform	Conversation New Verified Plan		
Receivers:		(b)		
Content: Pb2 <t1(c1,c3,c< th=""><th>4),T2(C2),T3(C2,C5)></th><th>ACL Message ACLMessage Envelope</th></t1(c1,c3,c<>	4),T2(C2),T3(C2,C5)>	ACL Message ACLMessage Envelope		
		Sender: Vi Robots Manager@MRS_PI		
Conversation-	New Plan Blueprint	Receivers: Robotl@MRS_Platform		
		Communicativ request		
		Content:		
		T1(C1,C3,C4)		
		Conversation New Task		
	(a)	(c)		

Fig. 10. ACL-messages contain (a) plan blueprint – (b) verified plan – (c) task

Task (T₁) requires capabilities (C₁, C₃, C₄), which are unique capabilities of R₁, therefore T₁ is planned to R₁. T₂ requires (C₂), which is a common capability between R₁ and R₃. Therefore, the planner checks that R₁ has 9 tasks in its history plus a planned task T₁. This is less than the task history of R₃, which is 11 tasks. Therefore, the planner decides to plan this task to R₁, to balance the tasks among the robots. T₃ requires (C₂, C₅) which are unique tasks of R₃, therefore T₃ is planned to R₃. The planner sends the verified plan to the robots manager in an ACL-message as shown in Fig. 10-b. The robots manager parses the contents of the received ACLmessages, and then it starts to assign the tasks one by one

based on the verified plan. The task assignment is also done by sending an ACL-message as shown in in Fig. 10-c. The robot agent simulates a task by triggering a random timer. When the timer is elapsed, the robot agent sends a task done feedback to the robots manager. When the robots manager is sure that all the tasks are done, it sends a plan execution success feedback to the requests manager.

VI. SYSTEM PERORMANCE ANALYSIS

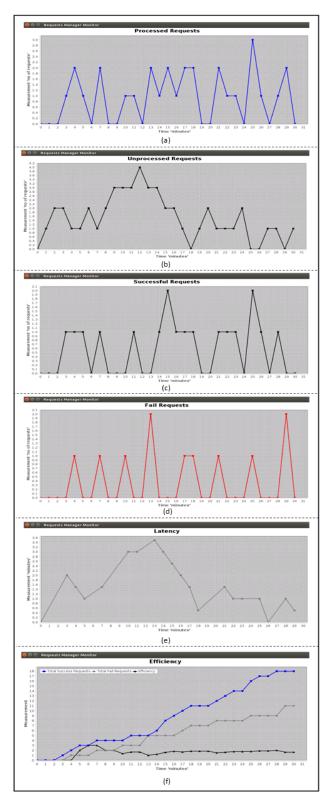


Fig. 11. (a) processed requests - (b) unprocessed requests - (c) successful requests - (d) fail requests - (e) latency - (f) efficiency

As mentioned earlier, the three sources of variations in the proposed case study are the plan blueprints, the number of registered robots, and the capabilities of every robot. The number of registered robots has been selected to vary during the system runtime. Therefore, the system performance can be measured. The system simulation over JADE has been run for 30 minutes. During every minute of the runtime, the requestor agent generates a random request. Additionally, one of the three robots agents randomly unregistered, and one randomly registered. The plan blueprints and the robots capabilities are fixed through the runtime.

The first set of performance measurements that are shown in Fig. 11 are calculated by the requests manager, because they essentially depend on monitoring the requests status. The processed requests chart in Fig. 11-a shows how many requests have been processed by the system at a certain time. Therefore, this chart expresses the system throughput (i.e., how fast is the system). The system throughput cannot be understood as an absolute value, because it is the summation of successful and fail requests. For example at the 4th minute of Fig. 11-a, the number of processed requests are two. One of these requests was successful and the other was fail, as it can be seen in Fig. 11-c and Fig. 11-d respectively. The system latency is shown in Fig. 11-e. The system latency is a very important performance measurement, as it expresses how much the system is delayed or late. For example at the 26th minutes of Fig. 11-e, the latency is zero. This means that the system has no time delay in processing the incoming requests at this moment. The system latency is a function of the unprocessed requests history, that can be seen in Fig. 11-b. The system efficiency is obtained by dividing the accumulated number of successful request by the accumulated number of the failed request. Therefore, when the system efficiency is below one, this means that the system is inefficient. However, Fig. 11-f shows that the efficiency value was higher than one most of the runtime.

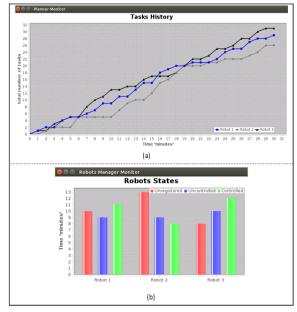


Fig. 12. (a) robots tasks history - (b) robots states

	Robot 1 (R1)	Robot 2 (R2)	Robot 3 (R3)
Availability $\frac{T_r}{T_{ov}}$	$\frac{20 \text{ min}}{30 \text{ min}} = 0.67$	$\frac{17 \text{ min}}{30 \text{ min}} = 0.57$	$\frac{22 \text{ min}}{30 \text{ min}} = 0.73$
Utilization $\frac{T_c}{T_{ov}}$	11 min 30 min = 0.37	8 min 30 min = 0.27	12 min 30 min = 0.4
Effectiveness $\frac{T_c}{T_{unc}}$	11 min 10 min = 1.1	8 min 9 min = 0.89	$\frac{12 \min}{10 \min} = 1.2$

Fig. 12-a shows the robots tasks history that is calculated by the planner. Although that the robots availability is changing during the runtime as shown in Fig. 12-b, the planner tries to balance the distribution of the number of tasks among the robots. For example, at the 6th minute in Fig. 12-a, the planner successes to balance all the robots tasks at the value of 5 tasks per each. Then the robots tasks history started to diverge, until the planner successes again to balance the robots tasks again at the 20th minute at the value of 20 tasks per each. Fig. 12-b shows the distribution of the robots states over the runtime period, which is calculated by the robots manager as it directly monitors the robots status. Table II is calculated based on the values of Fig. 12-b. Table II shows that R₃ is the most effective robot, as it was the most available and therefore the most utilized. R₁ and R₂ are less effective than R₃, however it can be seen that the planner tries to maximize their utilization, to reach to a close value of R₃ utilization.

VII. SUMMARY, DISCUSSION, AND FUTURE WORK

This article has highlighted a new dimension of the MRS problem, which is modeling and simulation of the solution architecture during the design phase, and hence evaluating its performance. Therefore, this approach can be used to compare different system architectures to find the best solution based on the system requirements. Modeling an MRS architecture enables the common understanding and the critical thinking of the system among the development team. Furthermore, it enables a technology agnostic representation of the system that separates the conceptual model from the implemented technology. On the one hand, the conventional UML activity diagram fails to clearly represent the process model of the MRS components, because it lacks of the convenient notations that express the logical relation between the tasks in a process model. On the other hand, the BPMN language can provide highly detailed analytical models of the components of the proposed architecture. Those analytical models are used during the coding to implement the different components of the system architecture. JADE agent development middleware is used to implement the MRS components, as the dynamic interaction among those components is needed to simulate the overall behavior. However, other technologies such as Robot Operation System (ROS) or Web Service (WS) can also be used to implement the very same models.

The simulation model has been used to measure a group of performance indicators under predefined constrains. Thus, these indicators are used to analyze and evaluate the proposed system architecture. Other qualitative criteria such as faulttolerance or robustness can also be tested during the design phase by using the same simulation model. This can be done by replicating or switching off some of the model components, then studying their effect on the system performance. Although the MRS scheduling and planning is not the main focus of this research, our solution approach can be used to simulate different planning or scheduling methods, to find the best technique during the design phase.

The BPMN language is originally designed to describe the business processes. Thus, an extension of the BPMN notations is needed to represent the MRS physical layer. This extension should reflect a representation of the humans and robots activities as the main elements of the MRS. The strength of using the BPMN appears when it is converted to the Business Process Execution Language (BPEL), which is an executable language that orchestrates the information among the WSs. Therefore in the future work, the same idea of building an executable model that can be directly used to generate the code will be considered. This can dramatically reduce the coding time and effort. Also in the future work, the same performance measurements that have been used in this article can be used in the implementation phase, as a part of the system visualization.

REFERENCES

- R. N. Darmanin, M. K. Bugeja, "A review on multi-robot systems categorised by application domain". In 2017 25th Mediterranean Conference on Control and Automation –MED, pp. 701-706, 2017.
- [2] Z. Ismail, N. B. S Sariff, "A Survey and Analysis of Cooperative Multi-Agent Robot Systems: Challenges and Directions", 2018.
- [3] INCOSE SEH Working Group. Incose Systems Engineering Handbook. INCOSE, 2011.
- [4] L. Bass, P. Clements, R. Kazman, "Software architecture in practice. Addison-Wesley Professional", 2012.
- [5] P. Clements, R. Kazman, M. Klein. "Evaluating software architectures", Beijing: Tsinghua University Press
- [6] C. Goerick, "Towards an understanding of hierarchical architectures. IEEE Transactions on Autonomous Mental Development", 3(1), pp. 54-63, 2010.
- [7] L. E. Parker, "Current research in multirobot systems. Artificial Life and Robotics", 7(1-2), pp. 1-5, 2003.
- [8] R. Alami, "Multi-robot cooperation: Architectures and paradigms". In Cinquièmes Journées Nationales de Recherche en Robotique, 2005.
- [9] I. Jawhar, N. Mohamed, J. Wu, J. Al-Jaroodi, "Networking of Multi-Robot Systems: Architectures and Requirements". Journal of Sensor and Actuator Networks, 7(4), 52, 2018.
- [10] F. Lüders, "Use of component-based software architectures in industrial control systems". Västerås: Mälardalen University, 2003.
- [11] J. E. Pérez-Martínez, A. Sierra-Alonso, "UML 1.4 versus UML 2.0 as languages to describe software architectures". In European Workshop on Software Architecture pp. 88-102. Springer, Berlin, Heidelberg, 2004.
- [12] I. Malavolta, P. Lago, H. Muccini, P. Pelliccione, A. Tang, "What industry needs from architectural languages: A survey". IEEE Transactions on Software Engineering, 39(6), pp. 869-891, 2012.
- [13] R. Eshuis, "Symbolic model checking of UML activity diagrams". ACM Transactions on Software Engineering and Methodology (TOSEM), 15(1), pp. 1-38, 2006.
- [14] R. Petrasch, R. Hentschke, "Process modeling for Industry 4.0 applications: Towards an Industry 4.0 process modeling language and method". In 2016 13th International Joint Conference on Computer Science and Software Engineering (JCSSE) (pp. 1-5), 2016.
- [15] S. Zor, F. Leymann, D. Schumm, "A proposal of BPMN extensions for the manufacturing domain". In Proceedings of 44th CIRP international conference on manufacturing systems, 2011.
- [16] N. Jennings, M. Wooldridge,"Agent technology", 1st ed. Berlin: Springer, pp. 3-28, 1998, ISBN 3-540-63591-2.
- [17] Jade, 2018. [Online], Available: http://jade.tilab.com/
- [18] A. R. Sadik, A. Taramov, B. Urban, Optimization of tasks scheduling in cooperative robotics manufacturing via johnson's algorithm casestudy: One collaborative robot in cooperation with two workers. In 2017 IEEE Conference on Systems, Process and Control (ICSPC), pp. 36-41, 2017.

- [19] M. T. Ionita, D. K. Hammer, H. Obbink, "Scenario-based software architecture evaluation methods: An overview". In Workshop on methods and techniques for software architecture review and assessment at the international conference on software engineering, pp. 19-24, 2002.
- [20] M. Hoffmann, "Analysis of the Current State of Enterprise Architecture Evaluation Methods and Practices". Tietotekniikan tutkimusinstituutin julkaisuja, (2008).
- [21] Z. Qin, X. Zheng, and J. Xing, "Evaluating Software Architecture". Software Architecture, Springer Berlin Heidelberg, pp. 221-273, 2008.
- [22] C. Sung, N. Ayanian, D. Rus,"Improving the performance of multirobot systems by task switching". In 2013 IEEE International Conference on Robotics and Automation, pp. 2999-3006, 2013.