

Thesis for the Degree of Master of Science in Software Engineering

APPLICABILITY STUDY OF SOFTWARE ARCHITECTURES IN THE DISCRETE MANUFACTURING DOMAIN

Dhespina Carhoshi Ermal Bizhuta

 $\begin{array}{c} dci18001@student.mdh.se\\ eba17001@student.mdh.se \end{array}$

Examiner: Thomas Nolte Mälardalen University, Västerås, Sweden

Supervisors: Mohammad Ashjaei Séverine Sentilles Mälardalen University, Västerås, Sweden

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Abstract

Manufacturing, under the umbrella of the latest industrial revolution, has gone through enormous changes in the last decades to then later evolve in what we know now as smart manufacturing. Different companies and entities have developed their own versions of architectures for intelligent and digitalized manufacturing systems. Ideating a flexible and safe architecture is one of the first steps towards a system that intends to be applicable in different environments, regardless of the vast variety of possibilities available. For this purpose, the following thesis presents an investigation on the state-of-the-art solutions of the most recent digitalized cloud-based system architectures in the domain of discreet manufacturing. Based on an initial system architecture conceived from the company ABB, an evaluation of this architecture was conducted, by taking in consideration the existing systematical approaches to the digitalization of this industry. In the following thesis work, we investigate, describe and evaluate the limitations and strengths of the most recent and known architectural approaches to cloud robotics. Finally, a few key remarks are made towards ABB's initial solution but also to the industry in general.

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1. Introduction

During the last few years, many researchers have paid special attention to Industry 4.0 and Smart manufacturing. This recently introduced term includes everything from digitalized and automated warehouses, logistics, renewable energy, resource industries and healthcare to smart cities. Industry 4.0 fosters the digitalization of companies and factories by utilizing machines and equipment virtually connected to be able to monitor and manage the processes of production. Smart manufacturing, a constitutive part of Industry 4.0, has been defined as the set of interconnected and collaborative manufacturing systems that respond in real time to the needs and conditions in factories, in the supply network, and in customer requirements [11].

This development comes with a rethinking of the companies' strategies and their investments, which means a total change in the company's operational and business models; eventually resulting in the need for further investigation on the new frameworks to be adapted. There is an aboundant amount of research on the specific technologies and approaches that involve Industry 4.0 due to the continuous development of the area, but there is still a large amount of scientific research to be done to be able to give companies assurance of what they need to change and update in order to adapt to the digital environment. One of the approaches has been the one of the automation multinational company ABB, which can be easily taken as a good example of how the benefits of this development can be obtained [12].

The focus of this thesis is the evaluation of different solutions of digitalization in the automated manufacturing industry, by analysing and reporting key remarks that can lead to further investigation about them. Furthermore, the other focus of the thesis is assessing the applicability of ABB's proposed solution through the PADME project (*Process Automation for Discrete Manufacturing Excellence*) in the reference company, which we chose to be GKN Driveline. Most of the concepts that we will focus on, are terms like Industry 4.0, Smart Manufacturing, Cloud Computing (CC), Industrial Internet of Things (IIoT), Cyber-Physical Systems (CPS), and Cloud Robotics, which are detailed further later in the thesis.

1.1. Problem description

There is an enormous amount of opportunities available with the digitalization of the discrete manufacturing domain. However, most industrial production has legacy systems that are not easily exchanged and strict requirements, much tougher than for consumer product, creating multiple challenges when it comes to implementation. Although the end goal is to have a complete overview of the discrete manufacturing process similar to how it is done in process industry - a stepwise approach, first providing the overview for selected sections or even only functions is advisable.

In discrete manufacturing, the final outcome of all processes is distinct and countable items, such as cars in the automotive industry, as in contrast to the continuous production in process industry where output could be a liquid like oil. Since latency in the systems is difficult to manage and overlook, an approach that is able to alarm and reduce those latencies in the processes is needed, so factories behind production can solve failures and adopt solutions as fast as possible. But most of the time, the process of overlooking through failures and proper functioning of the system is done with a human in the middle. In most of the cases the human can look into different pieces of information from different components of the isolated islands in discreet manufacturing. This information in most of the cases, is not in any way connected with each other. This makes it difficult for the factory involved in the process to subtract useful data reusable to analyze the defects in the processes. The main approach for this kind of problem is digitalization. However, to achieve effective digitalization in discrete manufacturing, the main step is to first build a system whose architecture can provide possibilities to simulate, analyze and better manage the production system and allow communication between the isolated islands of information. The architecture describes how the technologies relate and connect with the production equipment on the factory floor, more specifically, the set of interfaces, modules, components, and all the associations between them that make all the services possible, constitute the system architecture [4]. The way the system architecture is composed and how its components behave when connected are what make systems differ from each other, with architectures having their own characteristics that define different attributes of functionality, reliability, usability, efficiency, maintainability, and portability.

In this thesis, we have conducted an applicability study, which in other words means to conduct an investigation of the architectural systems found in existing literature; research studies; and projects, outline their specifications and examine the applicability of our case study to them. This will lead us to come up with research that not only investigates a real-life example of a system architecture, but with a proper outlook of the benefits and limitations of each analyzed system At the moment, since the topic of digitalization in discreet manufacturing is quite recent, there are few solutions with no standard and generic industry accepted solution. This thesis work aims to investigate the available solutions and study the applicability of them on different companies. ABB Corporate Research and ABB Control Technology in Västerås proposed an architecture in this domain within the PADME project, where its applicability will be investigated and evaluated during the thesis work [13]. The available architectures that included in the PADME project [14] lack proper evaluation in terms of consistency and adaptability with existing projects and their compatibility with technologies in other companies, so the main ambition of the project will be to evaluate the possible applicability of the ABB proposed architecture in other domains other than ABB itself.

During this thesis work, the following questions will be answered:

- What are the state of the art solutions on digitalization in the discrete manufacturing domain?
- What are the characteristics and limitations of the proposed architectures in comparison?
- What are the challenges in terms of applying a digitalization architecture on different domains?

Furtherly, we take an in-depth look at the ABB's proposed solution through the project PADME [15], its applicability in other domains and evaluate the results. This thesis is relevant to digitalization since it brings an insight into a tool with considerable importance in the Industry 4.0 domain and it focuses as well on architectures which are developed for realizing the manufacturing digitalization. To do so we start with reviewing and investigating the existing architectures in various domains. Then, we compare the architectures according to attributes, such as reliability, availability and security. This evaluation gives some insight about different aspects of the proposed architecture. Moreover, in this thesis we present the recent solutions which were developed by ABB Robotics via the project PADME [15]. We also investigate the practicality of using the same architecture on a different discrete manufacturing company than in ABB Robotics to present the applicability and limitations of the architecture. The comparison and evaluation of the architectures can be used from manufacturers which are still doubting on the otucomes of a system migration of the processes into a fully digitalized solutions with features such as data visualization, cloud integration and predictability of errors.

The remainder of the report is organized as follows: The first section of the thesis introduces the reader to the formulated problem and the goals which the thesis aims to achieve. In Section 2, we have explained the key concepts which are commonly mentioned throughout the thesis and are needed to be understood in order to be able to follow the thesis work and to properly capture the digitalization and architecture terms. In the same section we have described the system architectures proposed by PADME which are the case study of the work. Section 3 outlines the research methodology and the approach used to conduct the thesis work. Section 4 gives an overview on other applicability studies related to our work and the state-of-art of this topic, by identifying existing researches and the specifications of each architecture being investigated. Section 5 contains the analysis of the research and our observations about the evaluated case study can be found in Section 6. In the last section of the thesis, Section 7, we outline the main and results of the research and the limitations of our work, together with a discussion about the research questions and future work to be done on the topic.

2. Background

Industry 4.0 consolidates embedded production systems with intelligent production processes and is radically transforming industry production chains, especially discrete manufacturing of products. All electronic systems that perform a specific function and collaborate inside a larger system, by combining together software and hardware, fall under the term of "*embedded system*" [16]. Embedded systems are by all means subject to the modernization of the manufacturing systems to a higher intelligence level with every data about physical processes and information flows available at any time needed, as they make the basis of every manufacturing system.

Even if these systems are effective in fulfilling their main objective, intelligent manufacturing still requires certain supporting technologies to allow devices or machines to specify their behavior in different situations and requirements, apart from embedded systems. These technologies, like cloud robotics, are part of an advanced manufacturing model that functions under the support of cloud computing, Internet of Things (IoT), virtualization and sometimes artificial intelligence techniques. The technical aspects of these needs have been previously generally addressed with the application of concepts like Cyber-Physical Systems (CPS) and the industrial IoT (IIoT), explained below in this section. These services allow a modern interpretation of data via decentralized control and advanced connectivity by giving companies the opportunity to extract information that can be tracked, monitored, shared and can further optimize the functionality of the manufacturing system in real-time. Below we have explained some of these key concepts which are commonly used throughout the thesis.

2.1. Cyber-Physical Systems and the Cyber-Twin

With the help of Cyber-Physical Systems (CPS), we can oversee interconnected frameworks [17] between a system's physical resources and computational capacities. This term integrates computations with physical processes. Information about manufacturing components (machines and robots) and their corresponding modules are connected virtually by cloud to get synchronized. This virtual rendering of physical components is often termed as cyber-twin of that component in the system. The CPS manage big data through the inter-connectivity of manufacturing components to achieve the goal of intelligent, resilient and self-adaptable components. When the sensory data from the physical resources are extracted and converted into manipulable data, a cyber-twin of each component is responsible for capturing time machine records and recreating future steps to provide self-awareness and self-prediction for the system. The cyber-twin of each component allows CPS to provide intelligent capabilities in different sectors of the system's architecture, thus allowing the system to become self-configurable and maintainable. This level of computing provides optimized production and planning for factory management [18].

2.2. Cloud computing

PADME's main aim is to have a factory environment that would sustain all processes of digital manufacturing by cloud-connected robots in an automatic way. Digital manufacturing takes advantage of cloud computing frameworks since a cloud-based platform can be ideal for integrating different business entities and locations and extending integration to suppliers and customers. Technologies, such as Cloud Computing, Simulation and Data Analytics, promise to deliver these benefits. Cloud computing is a set of services that enable access to distributed and shared computing resources over the Internet, including information processing, information storage and massive data sets. Cloud computing interacts with robots by offering them higher computational abilities through greatly parallel calculation and information storerooms.

Cloud robotics [19] is a term used for cloud solutions and robotics, part of an architecture that mainly consists of two components cloud infrastructure and the automated robots and equipment. The cloud infrastructure consists of many high-end servers and large databases able to handle processing and computation of industrial speeds. In Figure 1, the architecture above and all components of a cloud robotics system are presented.



Figure 1: The system architecture of robots operating via cloud from Wan et al [1]

2.3. Internet of Things (IoT)

Internet of Things (IoT) is a crucial part of the use case of the thesis work, as GKN and the system architecture of PADME overall make use of sensors so to exchange information between components of the architecture. IoT relates to robotics through the use of nodes, which then make possible the creation of IoT sensors, devices and platforms [20]. These nodes interact on a cooperative basis and are, in most cases equipped with a variety of sensors, as shown in Figure 2, that enable them to collect signals and data from them. In this way, with features like deployment of sensors, easy cloud connectivity and data analytics improve asset performance, IoT enables the integration of all pieces of smart connected machines with the wider enterprise. IoT also enables employees to use mobile devices for features like data analytics, augmented reality and transparent device inter-connectivity. In Figure 3, we can see all the possible components of an IoT system and their communication connection. The architecture uses wireless sensors connected to the network, where the data is transferred from node to node through each sensor. The edge node serves as a gateway between the wireless sensor network and the internet, and the best part of using it is that it can provide local storage and have a user interface. The IIoT architectures are usually composed of a large number of connected sensors and actuators spread in wide areas such as factories or even environments like windmill fields.



Figure 2: Sensors and actuators that allow connectivity inside the IIoT architectures



Figure 3: An IoT system has a three-level architecture; devices, gateways and the data system [2]

2.4. The system architecture proposed by ABB

The base architecture that will be used to perform the applicability study will be the one from ABB. Its solution is an architecture, the pinnacle of which is the inclusion of the ability for analysis, monitoring and controlling of processes [14]. The processes happen inside the cell, a term used to refer to the altogether of components that are the robotic hand/controller, the Programmable Logic Controller (PLC), the nut runner (used for loosening and tightening physical components) and the *oil filling system*. The components of the cell are connected with the 800xA, which is a distributed and electrical control system with the capacity to improve the overall efficiency of systems through operator performance and asset monitoring. The operator interacts with the 6axis robot controller and the AC500 PLC with three Safety IO modules and two non-safe modules through the Human Machine Interface (HMI) application with its specific communication protocol. In the architecture, all production cells are connected with each other, and the visualization of the information is possible inside the cell and is made possible from the data collected through the 800xA, which provides at the same time the data required for the simulation and analytics application (SAAP) [14]. The architecture proposed by ABB comes with several versions that differ from each other by their type of connections and ways of information storage, but the main rationale of the architecture is that the components in the cell mentioned above store their data in a local database. Therefore, apart from this version of the architecture with direct communication between components, ABB has introduced two other solutions¹:

• ABB Ability solution with Edge-to-Edge communication

In this architecture, an indirect approach is used by using Edge to pull data form the robot, while for the communication of the SAAP with the 800xA system a cloud-based approach is suggested, where the data is made available on cloud storage through different cloud services. The data from the robot is pulled into the PADME *Robotic Ability Edge* (a concept of an ABB Ability framework) through an *Edge-to-Edge* communication protocol. To send the data to the 800xA and Ability cloud an Ability infrastructure is proposed, and information collected from other components such as PLCs, nut runners and the oil-filling systems goes through Edge directly to the Ability cloud.

• Simple ABB Ability Solution

For the successful communication of the SAAP with the 800xA system, ABB ability framework is again used. In this solution, data is pulled from the robot to the 800xA system through the direct approach of using the OPC protocol and OPC server, which will be explained in the subsection below, as this protocol is a relevant factor of ABB's architecture. This approach supposes the OPC server, and a special instance of that classic OPC server specifically developed for that robot controller to be implemented in the robot side of the architecture. This solution imagines as possible using another alternative that would pull data directly from the robot through a Robot API, which would, in this case, be required to be equipped with a data access API to be developed within the 800xA node.

• Database Solution

This last architectural approach differs from the others from the communication type of the SAAP with the 800xA system. ABB has suggested the use of a local database, more specifically a Mongo one. A direct approach with an OPC UA protocol is suggested for transferring the data from the robot to the 800xA system.

For a better understanding of the components and connectors of the architectures, we have represented the solutions from ABB in Table 1.

 $^{^1\}mathrm{Source:}$ PADMEs System Architecture, ABB, 2018

Solution	Components	Connectors	Figure
Ability Solution with Edge to Edge communication	 PLC Nutrunners The oil-filling system Robotic Ability Edge Web Server Robot Controller SAAP OPC-UA Server OPC Client Edge Data Publish and Deploy PLC 	The cells with the robot controller communicate in a direct way.	Robotic Ability Edge-to-Edge FADME Ability Cloud FADME Ability Cloud FADME Ability Edge-to-Edge FADME Ability
ABB Ability Solution	 PLC Nutrunners The oil-filling system SAAP Classic OPC Server OPC-UA Client Edge Data Publish and Deploy Ability Cloud Framework 	 PLC connected with robot controllers and data storage to communicate. To make a connection between the data from PLC and the cloud and otherwise is needed a gateway. 	Authorized Web Client Web Server SAAP Volvo Ability Edg Replica Volvo Ability Edg Generation Ge
Database solution	 SAAP PLC Robot Controller Nutrunners Oil Filling system Classic OPC Server Mongo (Database) OPC-UA Client OPC-UA Server API Integration 	 Cloud-based approach for the communication of SAAP with 800xA system Availability of the data to the cloud are done with different cloud services. 	Authorized Web Client Web Server SAP PADME Ability Cloud Data Access API (mexiltrer brain PADME Ability Edge PADME Ability Edge Generation (mexiltrer brain (mexiltrer brain (mexiltr

Table 1: The architectures of PADME's solutions

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• OPC Unified Architecture Protocol

The OPC, OLE (*Object Linking and Embedding*) for Process Control is a software interface standard that allows computer programs to communicate with copious industrial equipment [3]. The OPC Unified Architecture, in short OPC UA, is the communication protocol profile based on the OPC, it is widely mentioned in the thesis as it is the main protocol used for the communication of the components in the PADME system architecture of ABB. OPC UA is an open platform, compatible with several operating systems and programming languages, that allows information exchange between industrial systems and its further manipulation and use [3]. OPC has been the choice for being the main communication protocol of PADME since it has remarkable compatibility with existing systems, it is secure, extensible and can easily be integrated into most platforms [3]. Below, in Figure 4, we get a brief overview of how OPC UA works; as we can see, the information modeling that OPC UA has allows it to be operable and changeable according to the vendor that intends to make use of the protocol, by appropriating data types and structures in specified profiles by the vendor.



Figure 4: Information modeling of the OPC UA [3]

3. Method

In order to successfully perform the research, first, we needed to conduct a proper literature review to find other studies similar to ours, which gave us results that we describe in the next section of the thesis. After the literature review, we conducted a set of visits at ABB where we had a close approach with the system and architecture and after that a case study at one of the partner companies of the project, following steps suggested by Wohlin et. al. [21]. These steps describe how the work should go through five major processes when evaluating and conducting a case study, as follows:

- 1. The case study is designed and planned according to the decided objectives from the researchers.
- 2. Procedures and protocols for data collection are defined prior to the collection of data.
- 3. The case study is conducted while constantly collecting data on the case being studied.
- 4. Collected data is thoroughly analyzed.
- 5. After being analyzed, the data is reported.

The goal of the case study is to help us better understand how the system works, discuss our concerns with the people involved in the project and last evaluating the applicability of the system in the other company. The visits to the companies provided us with answers and insights, which helped us in our research. To conduct the applicability study most efficiently, we are going to make use of the guidelines [22] on how to do an evaluation of system architectures in software engineering, which consider attributes that define the system's quality such as performance, security and modifiability. Further assessment was used to evaluate how the architecture's components (modules, objects, processes, subsystems, units) communicate inside the system. The assessment includes relevant relations such as calls, sends-data-to, synchronizes-with, uses, depends-on and instantiates [22].

3.1. Determining aspects of architectures

A system architecture of discreet manufacturing processes, to be able to satisfy the consumer requirements, must have high reliability, security, availability but not only, as shown in Figure 5, regardless of its type and application domain. Due to the nature of our case study, the attributes which we are able to draw out so to make the comparison and evaluation are mostly the security and type of the architecture and its functionalities, which are determined by the key technologies they make use of. Below we describe these two most important factors that were targeted in this thesis.



Figure 5: Utility tree of the architecture's attributes

1. The type of architecture and its functionalities

Different types of architectures are available in the industry nowadays, but the resemblances that they have with each other allow us to categorize them into several types, as seen in [23]:

- Service-Oriented Architecture
- Network Architecture
- Infrastructure as a Service (IaaS) and Virtualization Architecture
- Robotic and Embedded System Architecture
- Online and Offline system of Cloud and Robot grasping architecture
- Cloud and IoT Architecture

The functionality of a system architecture is determined from the decomposition of its interface [14]. In this thesis, the decompositions of the architectures being evaluated differ mostly from the components being used and the connections between them. Therefore, in the upcoming sections of this thesis, it will be demonstrated that aspects such as the key technology and the patterns of communications between components, connectors and modules of the systems, being indicating factors of how the system functions, are the basis of the applicability study.

2. The security of the architecture

Security is one of the main focuses of the architectures, especially in the case of the architecture of PADME, where solutions which are safer *(local database)* are selected instead of ones that might offer a faster access but with questionable security *(cloud services)* [14]. Most of the data which is transferred over the network and is used to interconnect the smart factory is necessary to be adapted to the right cyber-security measures on the network. Apart from virtual layers of security, physical security of each device is also important, since hacking a device within the factory would ultimately lead to a compromised network with device malfunctions.

3.2. Standard procedures of assessing architectures

The architecture of a system is the design software development that addresses the quality goals such as security, reliability, usability, modifiability, stability, and real time performance [24]. It is of crucial importance for the success of a system, and it is a standard part of the development cycle. In order to assess an architecture, several standard procedures and methods have been proposed and are in use. In the methods described in Section 2, it is mentioned that an evaluation can be applied at any stage of an architecture lifetime. The evaluation of an architecture begins when the architecture is known but the implementation has not started yet [4]. The evaluation of the architectures and their specifications will be made according to the steps proposed by Gampa et al [25] used in almost all of the following proposed methods for the evaluation of the architecture [25]:

- SAAM Scenario-based software architecture analysis method.
- ATAM Architecture-based Trade off Analysis Method
- ALPSM Architecture-Level Prediction of Software Maintenance
- ALMA Architecture-Level Modifiability Analysis
- SBAR Scenario- Based Architecture Reengineering
- SALUTA Scenario-based Architecture-Level Usability Analysis
- SAAMCS SAAM for Complex Scenarios
- ESAAMI Extending SAAM by Integration in the Domain
- ASAAM Aspectual Software Architecture Analysis Method
- SACAM Software Architecture Comparison Analysis Method
- DoSAM Domain-Specific Software Architecture Comparison Model
- CBAM Cost Benefit Analysis Method
- FAAM Family-Architecture Analysis Method

We have chosen to do the evaluation of the architecture with the following three methods SACAM, ATAM and DoSAM, since their structure and the steps involved in each of them are the most suitable for discreet manufacturing system architectures, and our case, considering that in our applicability study we do not take in consideration factors such as cost-benefit and complex scenarios. Furthermore, the architectures to be evaluated are not only software-based so the majority of the evaluation types cannot be used. The first two evaluation methods (SACAM and ATAM) take on a more general approach to the comparison of the architectures, while the last one DoSAM allows us to look more in detail to the specifications of the system. Hence the evaluation then tackles aspects that account for most of the weaknesses and strengths of the system.

A. Software Architecture Comparison Analysis Method (SACAM)

The Software Architecture Comparison Analysis Method was created to provide a ground system to use when selecting an architecture that will best suit a system. It is the most suitable method of evaluation for architectures of the same domain [4]. The SACAM compares architectures by taking in consideration the business goals of the organization proposing the specific architecture. In our case, we can say that all the architectures have a common business goal, a system that will be smart, automated, cost efficient prone to be always up-to-date and that will continue to be relevant when future technologies take place in the organizations adapting the architectures [4]. To evaluate the architectures via SACAM, we make use of SACAM's indicator system to determine the criteria architectures are compared with. First, architectures need to be analyzed so to identify the criteria and then prioritize the most important ones with the most prominent influence on the evaluation. The architecture's style, design, complexity and patterns regarding components and elements are concrete indicators that capture key quality attributes of the system like performance, availability, modifiability and security. In our case, as indicators for all the evaluation methods, we will evaluate the following architectural aspects [4]:

- **Topological evaluation** (the architectural style used).
- **Components**(e.g. modules, objects, processes, subsystems, compilation units, and so forth) which document the different units of the architecture, address the modifiability of the system.
- **Connectors** (e.g. linkage between modules, connections across the network, configurations of server addresses) which document the concurrency behavior of the architecture.
- Patterns of communications between components, connectors and modules in our case, it documents the different ways that the units as mentioned above communicate with each other and exchange information

B. Architecture-based Trade off Analysis Method (ATAM)

The focus of this evaluation method is finding crucial tradeoff decisions of the architectures and detecting contingencies that might negatively affect the system by highlighting at the same time a variety of attributes such as modifiability, portability, extensibility, and integrability [4]. By evaluating the implications of each trade off this method also gives insight on the quality attributes by exploring the different interactions and the interdependencies mechanisms between them. Therefore, ATAM aims to show that architectures satisfy the requirements efficiently. This method consists of four main phases: Presentation, Investigation and Analysis, Testing, and Reporting [4]. The phases their selves contain several sub-steps to follow while conducting the evaluation:

Presentation Phase

Step 1: Understanding ATAM and how it is executedStep 2: Identifying business drivers and goalsStep 3: Analyzing the whole architecture

Investigation and Analysis Phase

Step 4: Identifying architectural approaches and trade off pointsStep 5: Generating the utility tree of quality attributesStep 6: Analyzing the approaches

Testing Phase

Step 7: Brainstorming of properties and their prioritization Step 8: Reanalyzing and comparing the architectural approaches

Reporting Phase

Step 9: Presenting the final results

C. Domain-Specific Software Architecture Comparison Model (DoSAM)

The DoSAM method compares system architectures by referring to a framework that makes possible the evaluation of systems of the same application domain [4]. The framework consists of the domain architecture *blueprint* (the architecture's design and style) and the services which are offered by the architectures. We chose this as the third evaluation method, since all the architectures we have chosen as cases to review are all a part of the same domain, the one of discreet manufacturing. Although DoSAM is restricted into evaluating only architectures of the same domain, this method allows us to localize constituent components, which are virtually present in every solution that is going to be compared [4].

In DoSAM, evaluation is performed by taking each quality attribute of the system architecture and pairing it with the attribute special metric, which represents that attribute. In our case, an example of how this pairing is done is the *architectures' security* as a quality attribute and the *data storage service* serving as a metric for it. In the Figure 6, we can understand schematically the logic of this evaluation method by viewing the framework of comparison (DACF) which makes the DoSAM evaluation possible.



Figure 6: The Domain Architecture Comparison Framework (DACF) [4]

The framework of the architecture domain comparison requires the evaluator to first understand the blueprint of the architecture, identify the services and goal of it, and then after obtaining the metrics needed to assess each attribute to then evaluate by using computational techniques based on weighted values when they are available or by performing an evaluation based solely on the nature of the metrics being compared [4].

4. State of the art review

In this section we are going to summarize the works related to out applicability study, and then present the state-of-the-art solutions that correlate to the case system architecture being studied in the thesis.

4.1. Previous applicability studies and related work

At first, we started the literature review by searching with the terms that define a broad category of smart factory solutions. The literature was executed in online databases such as *Google Scholar, Google* and research databases like *IEEE, Springer, ResearchGate*, by searching with terms that characterize a general class of smart factory solutions. We analyze the key technologies like *Collaborative Process Automation Systems (CPAS), Industry 4.0, IoT, Big Data Analytics (BDA), Cloud Robotics, System Architectures, Communication Protocols.* Topics that we investigate are related to digital approaches in discrete manufacturing and alternative solutions to ABB's in smart factories.

Although, some of the papers we reviewed provide just a basic overview of collaborative manufacturing management systems and how these systems support integration and communication across the manufacturing value chain. This lead us in discarding those results, as they describe the process of digitalized manufacturing in the big picture of the supply chain and do not give an in-depth review of the architecture the system uses. It is important as well to outline that to find some of related works for this project we needed to explicitly remove the term architecture and applicability at times, since some cases did not consider the blueprint as an architecture of components, but more like the workflow of processes of one component (mostly the robotic arm) and how it communicated with the other remaining parts.

The related works to our thesis consist in researches on the applicability of one specific service or framework or analysis which compare real-life approaches from a comparative point of view of several architectures.

In 2016, Bouziane et.al [26], by using web service technologies, demonstrate the applicability of a ROS-based approach (ROS is furtherly explained in section 4.4 of robot as a service in cloud computing. They have implemented a solution that fits the ROS technology in an architecture compound from a robot controller which is managed via a Java web interface and ROS messages. The solution consisted in the hypothetical addition of a communication layer between the robot and the provider, but still lacked the future step that would see the solution implemented in the different levels of an architecture and on a real robot as well.

In 2013, Jordn et.al [27], present a roadmap for the future development of emerging application areas of cloud robotics applications. The current status of collaborative process automation systems is described in the paper, alongside with remarks on how the rising applications of cloud robotics are categorized depending on their use in the industry and their applicability area. The paper presents an application-idea for a Facebook for robots, where robots will supposedly make use of centralized data able to evolve cognitively through the robots reasoning skills and through the continuous usage of open-source platforms. The

Kehoe et.al, through an extensive survey of 150 participants on cloud robotics and automation, in [28], define the different solutions available in the industry and their possible applicable environments, by also taking in consideration the limitations of their applications. The aspect of the applicability of systems in time sensitive environments is also mentioned, since some applications have real-time demands and systems based on cloud can be prone to network flaws such as latency, bandwidth and quality of service [28]. Another aspect that Kehoe et.al mentions as important for the applicability in real-life domains, is the security aspect of hacker attacks with the goal of disrupting the functionality of the systems. Both Bouziane [26] and Kehoe [28] emphasize the importance of the security aspect when mentioning cloud, due to the nature of wireless infrastructures and the criticality of the information being exchanged in the systems.

Doriva et al analyzes several existing architectures within the cloud robotics area [29]. Apart from outlining the challenges that come when applying the architecture, the authors propose an architecture (which is named as a framework in the paper) that would overcome the security flaws aspect of the system and would shield every service inside a cloud-enabled robot architecture [29]. The authors investigate on several system architectures which are a case subject of this thesis work as well, such as RoboEarth, Rapyuta, DAvinCI.

In 2017, Yaguchi et al present a research which focuses on robotic cooperation on a bigger scale, which would supposedly affect several areas of the human's life like disaster management and manufacturing [30]. This cooperation sees the applicability of their suggested framework in cases where robots can create a common knowledge base out of their native architecture where they would pull data for their behaviors and issues. The paper mentions that the architecture of a system matters less than the applicability of the architectures when faced with the multiple challenged in real-life implementation, such as the quality of the service, namely latency, energy issues, safety and communication issues [30].

In 2018, Dawarka and Bekaroo in [23] investigate and compare existing cloud robotic architectures to identify their limitations and future work that needs to be done in that field through the evaluation methods used by Hu and Tay in [1]. In the paper it is acknowledged that the majority of the current state of art reviews about cloud infrastructures and robotics are mostly hypothetical and non-implemented in real life examples, making them questionably feasible. The author has gathered information from previous methodologies and researches and has classified the architectures like mentioned in section 3.1 of this thesis.

These methodologies summarize all the possible types of cloud-based robotic architectures, which are:

A. The architecture proposed by Terrissa and Ayad Service Oriented.

In this architecture the system is composed from two parts, the client and cloud side, which have an integrated Virtual Robot Layer that can manage the robot and virtualize it through its cyber-twin through web services [31]. On the client side the architecture consists of a *Client Administrator*, *Cloud Administrator* and *Cloud Robotics Administrator*, which operate on the Virtual Robotics layer of the architecture [31]. The architecture proposed from McCormick, which is discusses in section 4.6, follows the same principles as this architecture.

B. The architecture proposed by Wan et al.

Wan et al views a cloud robotics architecture made from two parts, the cloud infrastructure, as shown in Figure 1, where all the computing is processed, and the robot part [1]. This architecture proposes all the computing processes to be performed in the cloud so to be able to unload the robot from most of the tasks, with its management being done over cloud therefore resulting in less loaded robots with longer battery life and less possibilities of issues and flaws [32].

C. The architecture proposed by Mouradian et al.

Mouradian et al proposed an Internet of Things Infrastructure as a Service (IaaS) architecture for robots to be able to upstream applications as a service [33]. This architecture is composed of four main layers, them being the Network-Level Virtualization Layer, Node-Level Virtualization Layer, Physical Layer and Gateway Level. The top layer of the architecture is the layer which interacts with the IaaS made of sub-layers like the Publication Engine and Robot Monitor, while the Node-Level layer is made of the cyber-twins of the robots [33]. With this set of layers, the system is able to support several communication protocols and application programming interfaces (APIs) through the Gateway Layer, which gives an architecture extra flexibility and benefits due to multiple ways of robot adaptations.

D. The RoboEarth system architecture.

The RoboEarth system architecture is extensively described and analyzed in section 4.4 of the thesis.

E. The Cloud-Based Robot Grasping System Architecture by Bekris et al.

In this architecture by Bekris et al [33], which is specifically created for the grasping behavior of the robot arm, the system consists of an online and offline status and makes use of several *Google services*. When offline, the system sends *Computer Aided Designs* (CAD) to the *Google Cloud storage*. Through the *Google Object Recognition Engine*, the system is able to save the

specifications of the CAD and then identify the object with 3D sensors that allow the robotic controller to successfully perform the grasping of objects. When online, robots are finally able to store the log of their processes and behavior in the cloud server for later reference.

F. Service-Oriented Robot-as-a-Service (RaaS) Architecture .

The Service-Oriented architecture (SOA) described in [23] that views the Robot as a service consists of three blocks; the *RaaS unit*, the *RaaS cloud* and the devices which hold the SOA interface. Through the RaaS unit customers can access a repository of possible libraries and tools for their needs, while the cloud holds different applications implemented in the units.

G. IoT-based Cloud Robot Architecture.

The last type of architecture is IoT-based and is ROS-based [23]. It consists of the cloud layer, the ROS nodes and the IoT enabled objects. The cloud layer offers access to modules such a *Web Dashboard* and *Data Lake storage*, while the ROS nodes act as *integrators* and *controllers* for the cloud layer and the IoT enabled objects.

4.2. State of the art solutions

After analyzing results obtained, we found papers that provided theoretical researches on the topic, like the paper written by Martin Hollender and ABB engineers Collaborative Process Automation Systems [14]. The paper is based on the book with the same title by Hollender [14], where he presents a complete overview of the state of the art in CPAS by explaining the systems and right infrastructures needed for the well-functioning of collaborative automated systems. CPAS. The paper is written by researchers who work at ABB and emphasizes the position ABB has in this sector, by highlighting the OPC Unified Architecture (OPC UA)² and its effectivity when connected with ABB's 800xA device, a crucial component of our case as well. This work mentions several benefits of using the OPC UA protocol for its flexibility, capabilities and security. However, to broaden the horizon of the searched papers we focused more on articles using approaches different than the standardized OPC UA. The authors in the papers mentioned above believe that OPC UA with its extensible modeling potential is well suited as a communication technology in this field of manufacturing automation.

The most relevant works related to the topic of our research are the *RoboEarth project* [34], the *McCormick research* [6], *TEMBOO*, the solutions offered by the company *KUKA* [35], *Comau, Yaskawa*. Due to the big amount of related works, we disregarded papers that only described the behaviors of the robot controller, and did not give any insight on the inclusion of the robot in any kind of architecture, like the cases of *Kawasaki* and *Fanuc* (both based in the production of the robot controller only), *Stubli* (no relevant information for the study found). In those cases, the only information or papers that could help our investigation were papers that described the collaboration of the robot controller with other systems, most of the time hypothetical structures that did not go in detail into any possible architecture the robot could fit in, but briefly describing processes vaguely such as the one in the figure below.

The applicability study would not have been possible if analyzing architectures just by a simplified overview of the architectures like in Figure 7, since it would not give us any detailed information about communication protocols and other components. Hence, the system architectures that we will describe and evaluate in the subsections below will be the ones shown in Rapyuta: The RoboEarth Cloud Engine paper, TEMBOO's website, DAvinCI Operating Systems for Cyber-Physical Manufacturing paper, the KUKA-DLR Lightweight Robot arm paper, Hirebotics, Comau and Yaskawa's website.

4.3. DAvinCI

DAvinCI is a software framework for the management of service robots not only in discreet manufacturing, but also in environments like office building, airports etc. It is designed as a system that contains three sections, as shown in Figure 8: the *DAvinCI Architecture Layer*, the *DAvinCI*

²OPC Foundation Website https://opcfoundation.org/about/opc-technologies/opc-ua/

 $^{^3\}mathrm{Resndiz}$ et.
al, An FGPA-Based Open Architecture Industrial Robot Controller, IEEE Access, 2018



Figure 7: A simple robot control system.³

Modeling Framework and the DAvinCI Runtime Library. Its architecture is based in computation, with the main focus on using cloud to establish the connection between robots. The DAvinCI Modeling Framework provides a rich set of Computer-Aided Software Engineering (CASE) tools, which automate the modeling process and connect it to the Graphical User Interface, together with the database design and the application logic, which is done by using the Unified Modeling Language (UML). The main difference between the Web Engineering frameworks is the architectural concept of DAvinCI, which is described in the DAvinCI Architectural Layer, as shown in Figure 8. The architecture depends on the presumption that, for a Web application the hypermedia paradigm is not very suitable. The hypermedia paradigm says that an established web site depends on URLs, hyperlinks, and different sorts of assets which is the essential idea of hypermedia systems like the Web. That is why when DAvinCI was developed the main idea was to eliminate that paradigm and to add an extra layer between a servlet container and the application. A servlet container is an application server that is used to implement programming models to write components like servlets, process HTTPS requests through a version of the Java Servlet Specification [5].



Figure 8: DAvinCI's Web Engineering Framework [5]

The DAvinCI project uses ROS as the informing structure to get information into a *Hadoop* cluster, which is a special type of computational cluster designed for managing big amounts of unstructured data in a distributed computing environment and demonstrate the upsides of cloud computing by parallelizing the *FastSLAM algorithm* [36]. The FastSLAM algorithm is an algorithm that estimates the robots location, and scales it logarithmically with the number of landmarks in a given map. The DAvinCI Architectural Layer gives concepts which are absent in the *Servlet* API but basic for Web applications [5]. The characteristics of the DAvinCI Web Engineering

Framework are:

- A web application, part of a software with proper application logic and business use case.
- A web session that includes a hierarchical view tree model with switchable sub-trees. GUI can change during the session.
- URLs are referred to as actions that can be invoked.
- During the modelling of an application with DAvinCI, the HMI is well defined and user-friendly.

DAvinCI's architecture, even if it is a framework, it consists of a mix of all the components of the architectures which are the subject of this research. Starting from the ROS environment and the SLAM algorithm, there is an obvious similarity of this framework with the ABB solution. Therefore, the applicability of PADME can be conducted through the update of the system with an OPC UA communication protocol, as well as in the Modeling Framework.

4.4. ROS - Rapyuta and RoboEarth

The Robot Operating System (ROS), is an open-source collection of libraries and pre-made tools that can be used from any developer or system architect to ease their work in robotics [34]. ROS has made possible the creation of thousands of tools for different robots, as we will see below in the thesis, making the operating system an undiscussable key actor in the robotics area. The example that we choose to discuss about is the RoboEarth project, [34] the aim of which is achieved by an open source cloud robotics platform called Rapyuta, based on ROS. Rapyuta authorizes robots to delegate their computational tasks to the cloud through secured customizable computing environments within the cloud. The computing environments in Rapyuta are compactly interconnected, enabling easy deployment of robotic teams. Regarding the implementation of this framework, in the paper of Hunziker et al. [34], three common test cases are described, with their specific benchmarking and performance results and working demonstrations of the system in action. The authors mentioned above in the papers in this study provide detailed performance measures of Rapyuta in comparison to Rosbridge, a middle layer between components, by measuring the round-trip times (RTTs) of different sized messages between two processes. It is worth mentioning that this middle layer between components is not found in PADME's solution.

Rapyuta uses web protocols that allow access via a web browser. In Rosbridge and Ros.js [37], Rosbridge regards ROS (robot operating system) a back-end component of the architecture and uses it as a low-level control interface. Rosbridge layers a simple socket serialisation protocol, which allows developers to create custom applications that interact with those protocols. Ros.js is composed in a way that integrates ROS with the web as universally as possible. Rapyuta uses web sockets for persistent connections and JavaScript Object Notation (JSON) compatible strings for messages [34]. Rosbridge provides only a part of Rapyuta's functionality since the latter allows the client to interact with multiple ROS computing environments, i.e. computing environments, over the same connection, which leads to a more complex protocol for Rapyuta. In section 6, a brief reflection is made based on the difference between the computing environments of Rapuyta and PADME. Rapyuta is mainly focused in the computing environments for robots to unload their assigned tasks, a deposit of communication protocols, a deposit of core tasks to administer the system, and an order information structure to compose the framework organization. Rapyuta's computing environments are implemented using *Linux Containers* [38], which give a lightweight and adaptable arrangement. In principle, Linux Containers can be thought of as an extended version of chroot [38] which separates the processes and framework assets inside a single host. Linux Containers do not reproduce hardware, and since all processes share a similar kernel supplied by the host, applications keep running at local speed.

4.4.1 Communication Protocols

In this subsection, we will describe different components of this architecture more in detail. Rapyuta's communication protocols are divided into three parts. The initial part is the internal communication protocol that covers all communication between the Rapyuta processes, the external communication protocol, which is used for the exchanged data between the physical robot and the cloud infrastructure running Rapyuta and lastly the communication between the Rapyuta itself and the applications which are computed inside the containers [34].

A. Internal Communication Protocol

This protocol enables effective internal communications for the Interfaces, which are used to communicate with external non-Rapyuta processes running in the robot or the computing environment. The Interfaces of the robot *Endpoints* convert an information message from the outer correspondence position (i.e. a *JSON4* object) to the inner correspondence group (serialized ROS message) and the other way around [34]. Rapyuta's internal communication protocols are responsible for all internal communication inside the architecture to be on time and with a clearly stated purpose of communication [34].

B. External Communication Protocols

The external protocol manages communication between the physical robots of the system and the cloud infrastructure of Rapyuta. The robots associate with Rapyuta throughout the *Web Sockets protocols* [39], such as Rosbridge [37], explained in the subsection below. This protocol was created utilizing the Autobahn instruments [40], which are founded on the Twisted framework [41]. In contrast to a typical web server, which utilizes pull innovation, the use of Web Sockets permits Rapyuta to be extremely broad contrasted with the ROS protocol utilized in the DAvinCI architecture [42], since it enables the integration of non-ROS robots, mobiles and internet browsers into the system. The last communication protocol utilizes ROS (robot operating system) as represented in Figure 9:, that communicates with another fundamental structure block of Rapyuta, the *Endpoint*, that consists of *Ports* and *Interfaces*. The Web Socket interface allows the parallel transportation of data as *large binary objects*, a collection of binary data stored collectively in a database as one, and, for certain kinds of data, by using ROS messages [34] and performing data transportation via data compression without any data loss whatsoever.

4.4.2 Basic Communication Example

To represent the usage and communication protocols, in the paper [34], researchers describe a straightforward model where a Roomba vacuum cleaning robot with a remote association uses Rapyuta to record and log its 2D pose. The communication happens in the following order:

- 1. Initialization of the action a distributed computing system for applying the framework in the robots is developed.
- 2. Data containers are created only one computing environment is used.
- 3. Nodes get configured without process separations or security layers.
- 4. Robot specific behaviors are implemented, and communications between processes are managed by a single ROS master.
- 5. Action is executed.

4.4.3 RoboEarth in a nutshell

The RoboEarth architecture is a collaboration of clients, RoboEarth Cloud Engine, RoboEarth Database which altogether make us of the ROS and Rapyuta. The clients are the Hardware Abstraction Layer that has Generic Software Components, which are shared in the cloud and then to the database. RoboEarth is composed by three-layers, as shown in Figure 9. The server layer is used to hold the RoboEarth database, where there are stored several standard models, including data on articles, situations, and activities connected to semantic data, and gives access to essential web services. The database and database services are open by means of regular web interfaces. The RoboEarth Consortium [43] is additionally implementing a hardware-independent middle layer as

shown in Figure 9, that provides different functionalities and communicates with robot-specific skills. The second layer implements the generic components, which are a part of the robot's local control software. Their main purpose is to enable the robot the interpretation of the map of the RoboEarth's robot behavior. The third layer is used for creating a generic interface for the robot's specific, hardware-dependent functionalities. Extra components are also available for the upgrade and expansion of the robot's detecting, reasoning, modelling, and learning abilities, depending on the customer requirements.



Figure 9: A simple robot control system.

4.4.4 The Rosbridge layer

Rosbridge [37] was developed as a middleware abstraction layer that offers robotics technology with a standard, minimalist application development framework that can be accessed by application programmers who are not expert in this area themselves. Rosbridge offers a simple, socket-based programmatic access to robot interfaces and algorithms provided by ROS through the use of Web technologies like JavaScript. Osentoski [44] proposed an infrastructure to enable Web services for robotics based on a lightweight JavaScript binding for ROS, called *Ros.js*. Ros.js exposes many capabilities of ROS, which enables application developers to develop controllers that are executed via a web browser. Users can develop their application through *Robot Web tools*, a collection of open source modules and tools for building web-based robot apps. Robot Web tools, as shown in Figure 10, combined rosbridge, Ros.js and open source libraries in JavaScript which facilitate the communication between the browser and the rosbridge. Robot Web tools, compared against standard ROS internal modules in terms of average bandwidth usage for transferring point cloud streams and other forms of compressed data, resulted more efficient in the compression of ROS messages, evaluated in terms of data size and compression time. Moreover, Sato et al. [8] proposed the Ubiquitous Network Robot Platform (UNR-PF), which realizes the design and development of robotic services that interact with people at different phases of their daily activities in various environments with the help of networked robot systems including robots, sensor networks and smartphones. The UNR-PF provides an API which can be easily connected with the components of Rosbridge.



Figure 10: Rosbridge's system architecture [32]

4.5. McCormick Research

During the research of McCormick, Operating System for Cyber- Physical Manufacturing [6], researchers are developing an operating system and manufacturing network that would find its use in large-scale distributed networks. For making possible the creation of a system with features like data visualization and managment, the paper describes that the authors focused on developing a Digital Twin (DT), which is the same concept as the cyber-twin described earlier in this paper. During the research, the system engineers developed a distributed infrastructure that consisted of a big data application module, which allowed users to recreate their own application through a visual editor. In short, the applications were directed graphs that used data mining and machine learning algorithms as well as programming logics, with edges as data streams. This application logic allows users to connect their programming nodes and build functional applications adaptable to customer requirements without needing to go into the core of the application and botch with the internal structure of the algorithms. As we can see in Figure 11, where a three-cell manufacturing system shares data via cloud controlled by the digital system management demonstrated in Figure 12, the system architecture proposed by the McCormick research is slightly ahead of PADME's architectural style since the three-cell manufacturing system is already conceived as connected via cloud. Not only data is connected via the cloud, but in the core of the architecture, we can find the NOAM (Network Operational Administration and Management) system, which by being connected to every layer of the system, allows the administration of every component inside them.

The system developed during McCormick's research was divided into four layers, *network layer*, *operating system*, *virtualization layer and hardware layer*, as shown in Figure 13. The hardware layer is composed by the cells that provide the data coming from the connected sensors, while the virtualization layer is an extra abstraction layer between operating, network and storage hardware, computing, and the application. In the core of the operating system, we can find the main database and the network layers, composed by CyMaN, a distributed network view, which on its own consists of NOAM and the Open Service Catalog Manager (OSCM) Broker connected with each other.

The OSCM Broker is an open source multi-platform service that enables end users to obtain and launch cloud resources and applications in self-service mode and manage cloud applications for service providers, IT Departments and End Users [7]. OSCM gives the opportunity to McCormick's proposed architecture to be always up-to-date and implement all emerging APIs adapted from the Service Broker Work Group. Furthermore, OSCM allows the integration of the data pulled from robots with cloud computing services widely used in the industry of nowadays, such as Microsoft Azure, Amazon Web Services, used for building, testing, and managing applications and services on the cloud. Based on the elements that compound the McCormick architecture, not only we can say that PADME's architecture is adaptable to it, but McCormick's research has already included inside its proposed structure a functional node to be connected with cloud services in the future.



Figure 11: A three-cell manufacturing system with shared resources on the network [6]



Figure 12: Components of the network layer of McCormick [7]



Figure 13: McCormick's proposed architecture [6]

4.6. Temboo's Architecture

Temboo was created as a start-up company and launched a system architecture that improves the functionality of a simple PLC by turning it into a smart device while connecting it with robot controllers and data storage and management services. [8]. Temboo has created a PLC IoT Application that works for several types of industries apart from discreet manufacturing, the Temboo's PLC Sensor Alerts and Data Visualization App.

On each physical model of the architecture, there must be an embedded computer to enable autonomous decisions and retrieve required information via cloud computing and CPS. In the architecture, the use of *Siemens SIMATIC S7120* basic controllers affects the range of functions and integrated IOs as well as their particularly compact space-efficient design. The Siemens SIMATIC S71200 PLC offers an overview of data going through the PLC, alerts when sensors read certain thresholds, and charts and graphs to interpret and understand the information, as shown in Figure 14 in an example about the levels of a water tank. From the hardware perspective, there needs to be a gateway, which is the internet connected device that serves as the main connection point between the data from the PLC and the cloud, and vice versa. Temboo has three *Machine to Machine* (M2M) communication protocols for Arduino boards: *MQTT, CoAP, and HTTP*, as shown in Figure ??.

When using Temboo, users have the possibility to choose which of the three protocols to use. Temboo, through M2M, enables the possibility to program flexible distributed device applications in minutes. Networked sensors and devices enable multiple sorts of IoT applications to be connected with robot controllers.

After analyzing all the structure of the architecture, we see that the Temboo's architecture and PADME's one have multiple similarities, with the only difference being the communication protocol and Temboo's alleged flexibility in getting integrated with several systems other than



Figure 14: Temboo visualization application showing the level of water. [8]

discreet manufacturing processes. We suppose that Temboo would be possible to implement if it adapted the communication protocols of PADME but kept its Data Visualization App and Sensor Alert service. In addition, one advantage of Temboo is that the connection between the PLC and the cloud services happen by using a cloud storage gateway, a connection point between the sensors of the PLC and the cloud [8]. The gateway works as well with development boards like Arduino or Raspberry Pi, which would be the first choice when opting for low-cost solutions and IoT applications.



Figure 15: Temboo's simplified architecture. [8]

4.7. KUKA

KUKA has developed many devices in the field of robotics and engineering [35], which are known to co-operate with each other in intelligent ways. KUKA has had the same approach as PADME and has already implemented a system architecture for discreet manufacturing processes. The main applications KUKA has developed are the *KUKA Connect* and *KUKA Control Panel*. KUKA Connect serves the middle-man intelligent device, while the Control Panel as a Human-Machine interface hub to the robot controller and other components. Since KUKA Connect is cloud-based, new features can be added without any KUKA Connect software installation required on a workstation, but instead they can be downloaded through the marketplace created specifically for this reason, called KUKA Marketplace. Meanwhile, the components of the architecture, compared to our case architecture, make use of the *Transport Layer Security* (TLS), cryptographic protocol suggested by the NIST for secure communication [35], which means that the company does not make use of the OPC UA protocol. Bischoff [35] mentions that KUKA uses a modular hardware structure and open, PC-based software architecture, which allows users to easily adapt the controller to the specific requirements of other systems, but also to get access to a wide range of expansion options. KUKA offers users as well an upgradable system software, ready-made robot applications and software-based controllers for the 3D visualization and simulation [35]. This makes possible offering constant support via a user-friendly interface for the robot's hardware and software, by making sure interactions between humans and machines are safe [35].



Figure 16: KUKA's System Architecture

In Figure 17, we have represented the architectural style that KUKA components are connected with, based on the descriptions found in [35]. The architecture's main components are the HMI, application-specific code, the KUKA Panel Control and KUKA Robot Controller. It is noticeable how the workflow of the architecture is differently executed compared to PADME. The robot controller, through an I/O device and the TLS communication protocol, sends information through the internet protocol TCP/IP to the user interface found in KUKA Control Panel. In Figure ??., we can notice instead of the differences with PADME's solution in the processes that the data from the robot controller has to go through. The data is pulled from the user input in the HMI and then get processed, features are extracted and then the components *KUKA Independent Function*, *KUKA Dependent Function*, translate the input into application code for the robot to start operating. The HMI allows the user to access the data stored through an Ethernet interface, where it can be later re-used from the data-acquisition system for advanced analysis and test logging purposes.



Figure 17: KUKA's Robot Communication

4.8. Hirebotics - Universal Robots

Hirebotics is a recently founded company which acts as a certified integrator and developer of the robots built from Universal Robots. Due to the company's recent creation, very little information could be found about the system architecture of components. Hirebotics uses TCP/IP for the connection of the robot arm with the cloud infrastructure, built from the company itself to support its services [45]. Since the company is supplied with the robot arms from Universal Robots, they do not include in the architecture a separate PLC, the functions of which are included in the robot itself with an expansion of it with Modbus TCP for expansion I/O [45]. Through TCP/IP sockets or XML remote procedure calls, clients can choose any stable framework from libraries able to have multiple functionalities for the robot and integrated it with API layers of the clients choice. The system is equipped as well with a user-friendly interface, integrated with the system and accessible with a mobile phone, or tablet. The Figure 18.shows a simplified version of how Hirebotics system architecture is compound.



Figure 18: Hirebotics' simplified architecture

4.9. Comau

Another company with another conception of a system architecture for industrial robots has been Comau, a company which in the late nineties implemented its first *Open* features with their third generation controller (*C3G Open*) and then some years later developed the controller further and came up with an updated robot controller, called C4G *Open* [9]. This controller had features such as sensory feedback control and adaption with the ROS project, explained in section 4.3. Engineers at Comau developed another version of the firmware of their controller for the sole motive of connecting it with the ROS interface. They did so by developing a ROS interface that contained:

- The ROS nodes for the implementation with the Comau controller;
- The Open Robot Library (ORL), which contains all the possible Comau controller motion planning;
- A simulated cyber-twin version of the Comau controller.

With the help of these tools, Comau made possible the control of a virtual or real robot controller, which supported both position and speed control through motion command initiated with the Open Robot Library and ROS. Before implementing ROS in the system architecture, Comau had a system architecture (Figure 19) that consisted of three layers: the control board, the robot management layer (trajectory, axis control) and the digital signal processing layer (I/O management).

The integration of Comau's system architecture and ROS, shown in Figure 20, was possible since both could support Linux containers. The existing modules of the architecture were integrated into ROS; several parallel threads were extended so to be able to decouple the real time data being communicated (input for controlling the robot and output to receive the status of it). With the newly adapted architecture, the user could command the robot via its cyber-twin, ROS messages and a TCP/IP connection [9]. The only problem with the integration with ROS was that ROS was not real time, while robot communication was, and to solve this, engineers developed a communication node, which included both real time threads (able to establish the connection between the controller and the robot) and normal priority threads (able to provide movements data to the robot through ROS messages or TCP/IP). The updated architecture was the following:



Figure 19: Comau's system architecture before ROS integration. [9]



Figure 20: The developed system including initial structure (red) of Comau using ROS. [9]

The updated system preserved the original components of the architecture (the robot controller, the C4G Open, and the motion library) but allowed the user to control the robot by replacing the company's specific libraries and replace them with any library. In this way, the system could be reused by the entire ROS community and evolved into an open source (the developed code was open source as well), freely accessible at industrial and research level.

4.10. Yaskawa

Yaskawa is a company which produces its own mechanical and robotic equipment, from PLCs, to machine controllers and HMIs. From the few public papers we could access, we were able to draw out some few notes on how Yaskawa concepts the collaboration in a discreet manufacturing system of its components.



Figure 21: Yaskawa's system architecture. [10]

Even if the architecture above in Figure 21. looks like the classic HMI PLC I/O Robot Controller combo we have seen throughout the thesis, in [10] it is emphasized that the architecture is equipped with a robot module, the *Robot Module RM100*, embedded inside the *machine controller MP3300*. This feature would supposedly improve the productivity of the whole system since the two components, being merged, used just one bus connection and the user would be able to synchronize the robot by using only the control cycle of the machine controller MP3300. In the picture below, we can see schematically the change in one of the system's most important component.

It is worth mentioning that, by embedding the robot module inside the machine controller, the user can manipulate the robot movements, motions, axis and behavior only through the libraries of Yaskawa's itself, since the robot module is embedded inside the machine controller. Because of this, Yaskawa pulled a new Robot Module Configuration that allowed the user to use the module with other robots manufactured from other companies [10]. This, together with the latest solution produced from the company in July 2018, the Yaskawa Cockpit, gave the system of the company more flexibility. The Yaskawa Cockpit, a use model of which is represented in Figure 22., is a fully cloud-implemented component applicable to any manufacturing system that is used to identify causes of issues in the systems and analyzing every single being communicated inside it.

From Figure 23, we can notice how the Yaskawa Cockpit can be connected to the PLCs, sensors of the robot controllers, logistic processes and the cloud. In [10], it is described how the Cockpit can perform model analysis through AI and machine learning, by allowing the inclusion of add-in for customers to require implemented from Yaskawa. Yaskawa Cockpit is compatible with the OPC UA, ERP systems, big data servers and almost any communication protocol available in the manufacturing system. The addition of AI and machine learning, together with the automatic



Figure 22: An improved machine controller by Yaskawa. [10]



Figure 23: One model of using the Yaskawa Cockpit. [10]

cloud connectivity and user-friendly customizable libraries can be considered a factor that brings Yaskawa on the top of the companies working on the digitalization of discreet manufacturing processes.

5. Analysis of the research and observations

In this section we are going to draw out some conclusions on the related works explained above and the differences, advantages and disadvantages of each architecture, based on the attributes discussed before.

Parameters Solutions	Type of architecture	Key Technology	Components	Communication between server and robot	Robotic language	Computing environm ent	Additional features
ABB's Solution	Service oriented architecture	OPC tunneling software to channel OPC data from 800xA, visualized through a SAAP tool	 PLC Nutrunner (Atlas Copco) Oil filling system Robot controller Database 	OPC UA protocols PROFINET	RAPID Programming language	Docker containers	Cloud service still not developed, no user-friendly UI.
RoboEarth (Rapyuta)	Robotic and Embedded system	Open-source Rapyuta and Rosbridge, core of functionalities is ROS	 Server Generic components Robot Specific Cloud Linux Container 	ROS framework (No OPC) and a web Socket- based framework	ROS messages, TCP/IP	Linux containers	Users can develop their own applications with Robot Web Tools and can connect through API
DAvinCI	Service- oriented architecture	Three-layered architecture based on ROS . Web-based	Cloud Network ROS (Robot Operating System) Cloud Fast SLAM Algorithm	ROS framework CASE Library to automate the modeling process	ROS messages	Servlet container	Cloud to establish a network between robots. Able to integrate with Servlet API Not Open Source
McCormick Research	Service- oriented architecture	Three-layered architecture, connected with NOAM Managemen t system and OSCM	 Big Data Application Network Cloud Three-cell manufactur ing system NOAM 	OSCM Broker service connects equipment data through several nodes with the main customizable application.	Visually based programmin g editor to program robots	No information	Fully implemented in the cloud Possibility to integrate data directly with Azure or Amazon Web Services
Temboo	Cloud robotics architecture	A multifunctional PLC IoT Application, Temboo's PLC Sensor Alerts Temboo Data Visualization App.	 PLC IoT Application PLC sensor alerts Data visualizatio n App Database MQTT COAP HTTP Cloud storage gateway 	HTTPS, CoAP, MQTT.	Pre- programmed robots with no need for coding Sketch builder for Arduino	Virtual Machines	The connection between the PLC and cloud is done via a cloud storage gateway. Sensor alert and data visualization application Ability of connection to MySQL, Google Spreadsheets

KUKA	Cloud Robotics architecture	Set of platforms operating together, KUKA Connect, Control Panel. Modular hardware structure.	 KUKA connect KUKA control panel Cloud PLC Software based controllers 	Java open source cross- platform interface called JOpenShowVar , allows reading and writing variables and data structures of the controlled manipulators.	KUKA Robotic Language, in collaboratio n with JOpenShow Var, a middleware Uses TLS, TCP/IP	Varies – Linux containers /RSI Objects	Cloud environment adapted with the system User-friendly UI
Hirebotics	Internet of Things - Infrastruct ure as a Service architectur e	The robot arm is connected through cloud and can integrate with user libraries	 Client API layers 	TCP/IP	Messages through TCP/IP or XML remote procedure calls	No information	Integrates easily with cloud No PLC needed Able to be integrated with APIs
Comau	Service- oriented architecture	Based in ROS, offers an Open Robot Library for users to choose frameworks.	 Third generation controller (C3G) C4G ROS node COMAU controller Linux container 	ROS framework	PDL2, ROS messages and TCP/IP	Linux container	Open-source environment, easily customizable with libraries.
Yaskawa	Infrastruct ure as a Service	Yaskawa Cockpit integrates manufacturin g processes with AI	PLC Robot controller combo Cloud- implemente d component ERP system	Flexible communication protocols, supports OPC UA	INFORM robot language	No information	Machine learning for issue management and data visualization. Can be connected with ERP and big data systems. Robot Module Configuration allows users to use other robots in the architecture

Table 2: Observations on the architectures

Table 2 above sums up the key points of the research conducted and leads us to some concrete results about the observations we manifested from our investigation. All the architectures that were evaluated during this investigation showed several similarities between them, the most obvious one being the choice of companies to make use of ROS, whether for communication purposes or as a main framework of their systems. Like Comau's example, in which the company did not use ROS until they adapted the components of their system architecture so to be able to give their users more freedom on their systems and robots, by giving them the possibility to use their own libraries. If the PADME project was based upon ROS, several advantages, especially more flexibility would have come with it. ROS, being an open source platform, is the main choice of newcomers in the industry, hence it would be the best choice for start-ups or new companies that do not have a huge capital to invest by ordering customized libraries from the companies that produced the robotic arm.

Moreover, if a user is not able to find the library that he wants to access, he can easily implement it himself through tools like the Robot Web Tool, based on ROS. Small companies, apart from choosing the ROS framework, would also take in consideration Temboo instead of PADME, since it promises to start working with only an Arduino and their intelligent PLC. During our research we noticed that the only official integration of ABB and ROS has been in the presentation [46], which dates only five months ago. The presentation shows possible ways and packages needed for successful integration of both services. A difference that we noticed was also the computing environment of the architectures, where PADME differs with most of them because of the use of *Docker containers* from ABB and Linux or Servlet in some others. In PADME's proposed architectures, the systems make use of Docker Containers, which according to [47] have been proven to be more efficient and innovative compared to the traditional Linux ones. Furthermore, we notice that applying the ABB Ability Edge architecture in Rapuyta's RoboEarth would result effectively as the update to Docker containers would offer the architecture elevated functions such as portable deployment, automatic application assembly from source codes, versioning, re-usage of components and make the system operate more efficiently with extended functionalities and more tools available for integration [47]. Apart from the computing containers, all the communication protocols which will be mentioned below are adaptable from ABB's solution.

Another weak point of PADME is the usage of OPC UA, which, even if commonly known as a very secure communication protocol, limits PADME's adaptability with existing systems and protocols. Yaskawa's system was the only one where we noticed that OPC UA was mentioned as a possible communication protocol, since other companies make use of TCP/IP, and some others of HTTPS, which have been found to be quite vulnerable [48]. From our consultations with the engineers of PADME, we were able to assess that using web sockets, TCP/IP, HTTPS, even if in Rapyuta's case it allows access to information via a web browser, would not be the safest solution for the handling of big data which is considerably confidential, as web sockets for connections and JavaScript for exchanging messages would make a vulnerable system [48]. As mentioned in 4.2.3, only one computing environment is used, without process separations or security layers and with the communications between processes managed by a single ROS master. From the other hand, the architecture proposed from PADME would be easily applicable in Rapuyta's case, due to PADME's solution ability for Edge-to-Edge communication and Rapyuta's mainly web-based data storage and computing performed in the cloud. A majority of the cases analyzed base their communication protocols again on the ROS framework and ROS messages, except from KUKA, which uses a Java open source cross-platform, the JOpenShowVar apart from the TCP/IP, DAvinCI, that uses predefined CASE libraries for robot-equipment communication, and McCormick's research, where the communication is described as happening inside the OSCM Broker service.

Through the OSCM Broker, in the case of DAvinCI, it is possible to connect the system to the most used web services of these days, Azure and Amazon Web Services, something which we see as possible on in the case of Yaskawa's Cockpit, able to support IoT services and even AI, which PADME's architecture does not even mention or plan to use. The different add-ons that the architectures can have, are what makes the difference at this point, since all of them are found to be using cloud, have already been proved to function and be applicable in real life factories. These add-ons, starting from the ability of the architecture to include visually pleasing user interfaces (the case of KUKA and Temboo) to the ability of being integrated with SDKs, APIs, or the expansion packs of KUKA and Yaskawa, are clear advantages that customers really consider before deciding to implement one certain service in their factory.

The last thing that was noticed during the evaluation of architectures was the lack of a cloud storage gateway in PADME's architecture. Out of all the evaluated cases, Temboo seemed to be the only one making use of a gateway between the storage systems in the cloud and the other components. This allowed Temboo to still adopt communication protocols such as MQTT, CoAP and HTTP but bridge them with a gateway

5.1. The clutter with robot programming languages

Apart from the difference in the communication protocol used, TLS, KUKA also makes use of their own programming language for robots and the other components, called the *KUKA Robot Programming Language*, while PADME, eventually uses a high-level programming language called RAPID. Now, when it comes to languages of operation of robots, we find ourselves in a critical part of our research about industrial systems and the automation industry, the incompatibility that has lately been noticed in the industrial robots'field. It has been noticed that companies which build and produce their own robots and are responsible for managing entire factories tend to have developed their own specific programming language, as we can see in the cases of this thesis, ABB has RAPID, KUKA has the KUKA Robot Language, Comau uses PDL2 [49] etc. Just recently, cases like DAvinCI and RoboEarth have agreed on making use of programming options like the ROS, to be able to port robot settings, interfaces from a robot to another without the limitation of the robot being of the same industrial domain or company. The differences in the programming languages of robots are parallel with the ones in the communication protocols that they use, as shown in the previous sections of the thesis.

6. Case study analysis

To perform this applicability study, the chosen company to evaluate the applicability of the proposed architecture was a company located in Koping, Sweden, called GKN Driveline Kping ⁴. GKN Driveline has updated conventional drivelines with its latest developments in the design and production of constant velocity joints (CV Joints), a market that GKN Driveline declares have proven to be successful in due to the way they have developed their manufacturing footprint. But, before visiting GKN, we visited the company as well responsible for the project PADME, the offices and factories of ABB Robotics. In the factory, we could have a closer look at the system architecture used by ABB and were able to assess as well how it worked. After meeting with several engineers behind the project we were able to estimate some of the attributes and requirements that the architecture demanded so for it to be furtherly applied in the reference company of our choice. The attributes were mainly connected with aspects such as:

- Application domain of the reference company
- Specific client configurations for the architecture assembly
- Reference company robot behavior and action's needs (e.g. lifting, screw-driving, grasping etc.)
- Security of the system (e.g. Safe mode of the robots, Safety Integrity Level)
- Availability of specific equipment in the reference company (e.g. AGV, size of disks, NC machines)
- Size of disks and sensors of the reference company
- PADME needs sharp PCs ready for 5G connection in the future
- SCADA Systems and their compatibility with PADME architecture
- Visual and communicative interfaces of the reference company
- Requirements regarding certified communication protocols
- Differences between tasks of specific behaviors (e.g. one task's action to one port)
- Utilization of the 800xA and 800xA package from the reference company
- Modifiability of 800xA for its later scalability and modular functions
- What kind of 800xA package the reference company will use
- Good integrity and redundancy to eliminate latency
- Qualification of professionals working with the ABB 800xA
- Number of tasks performed inside and out the company

6.1. Case study selection

GKN Driveline Kping AB is a multi-national company which is specialized in discreet manufacturing of automotive driveline technology and systems engineering. GKN Driveline operates as a subsidiary of GKN Driveline Headquarters Ltd. GKN Driveline Kping designs, develops, builds, and supplies automotive driveline products and systems by offering CV joint systems and freight services. The company declares that more than 50% of the 80 million new cars sold every year contain the GKN Driveline technology. We selected GKN as we know that it uses automated processes to produce its concrete products as well as the big size and expertise of the company. GKN produces everything inside its factory and has competence for the products it uses from design, to simulation and then the production of the components. Since it is a Tear 1 supplier between

⁴GKN Driveline Web Page http://www.gkngroup.com/gknsweden/

motor companies like Porsche, Volvo, Fiat etc. and the prime material, steel and other metals, GKN eliminates the need for a middleman by generating components by itself on time and with strict adherence to protocols that regard safety and other standards.

6.2. Methods of approach to the case study and observation records

During the visit, we were able to get a close look at the factory and its operational processes. GKN produced its constant velocity joints (CV Joints) through an architecture that uses the ABB robotic arms, the KUKA assembly line and the same HMI as ABB's Multi Panel Siemens HMI, which is the SIMATIC HMI of Siemens 30091. After the first visit that we conducted at GKN, we documented several questions regarding the process of the whole architectural system of the company's discreet manufacturing system. The paper presented at first the research that we are conducting, a sample of the PADME's proposed architecture partially implemented at ABB robotics. Afterwards, we prepared a table that aimed at assessing the applicability of that architecture at GKN through questions that were respectively about:

- The key technology of GKN's data acquisition system
- The key technology of GKN's data acquisition system
- Communication between components and equipment of the production system
- The availability of a management system and if there existed any communication between equipment and the mentioned system.
- The purpose of the information being exchanged
- If GKN would be open to using cloud features and 5G in the future.

6.3. Results of the approach

Unfortunately, GKN did not show interest in our research and did not answer our questionnaire. We attribute this to the company's busy schedule and their expectable lack of interest in the results of an investigation that would evaluate their discreet manufacturing processes. We theorize that the questionnaire, if answered, together with the visit we conducted at the factory, would be a proof of the company's non-specialized-for-automation production system, due to the absence of a concrete architecture for the production line and the non-willingness of the company to update their approach to automated processes and intelligent architectures.

6.4. Applicability of the case study

Based on the visit we conducted in the factory of GKN and on the observations we made after the analysis of all the architecture, we have come up with the conclusion that ABB's solution described in the PADME project *can be applicable* in GKN Drive Line and eventually in company of the same domain, size, and infrastructure as GKN. As we can see in the Table 2 below, GKN makes use of almost every component of ABB's proposed solution, like the *robotic arm of* ABB and ABB's Multi Panel Siemens HMI. The communication protocols of ABB's solution, its visualization application and its simulation and analytics application, can all be applicable in GKN. Therefore, the processes of GKN could be elevated to a more automized, intelligent and secure level if they adapted their production line systems to PADME and used components like the 800xA and the SAAP for the visualization and management of data. The usage of OPC-UA would as well be a reassurance of the security offered from the solution of PADME, even if the solution was customized for usage at ABB only. GKN was totally able to pull data from the components of the production line, but they did not do so, and even if they would extract such information, the engineers we met found questionable the purpose of making use of data collection. This suggests that the company, if it surpassed these limitations, would definitely benefit from the automatization of processes offered by PADME. They would be able to extract information about processes that compromised the production of their CV joint systems and then be able to

analyze the problems via statistical management of data. This data management would happen in the cloud, through the PADME Ability Cloud, or in the database, through Mongo, depending on GKN's preference, since the solutions offered by PADME include architectures that make use of cloud services but also local databases of the referenced company. Not only can ABB's proposed solutions be applied on a company like GKN, there are multiple domains, industries, and purposes where we found that they could be applied. ABB's solution through PADME is modular and can find its applicability in construction, transportation industry (vehicles, electromobility, trains, ports), fabrication, 3D painting and medicine. The current proposed architectures would need the addition of few elements like welding equipment, part positioners, high-resolution sensors etc. that can be connected easily with the 800xA and integrate with ABB's modular proposed architecture. The table 3 demonstrates once again the possible applicability of PADME by the analysis of the differences and similarities:

Feature Domain	Type of architecture	Key Components	Communication	Applicable
ABB's solution	 Service oriented architecture Modular 	 PLC Nutrunner (Atlas Copco) Oil filling system ABB Robot controller Database service 800xA PADME Ability Cloud ABB's Multi Panel Siemens HMI AVG SAAP Visualization application 	 Communication inside the cell happens in multiple ways, direct and indirect. Each piece of the cell (controller, 800xA, nutrunner etc) can communicate in several ways with the system Direct communication solutions with either OPC UA/classic OPC protocol Robot access API, and the indirect Edge-based solution using an OPC UA The concepted solutions include cloud and also database storage for the information Communication of SAP with 800xA system happens efficiently throughout a cloud-based approach. 	
GKN Drive Line	• No architecture	 PLC Nutrunner (Atlas Copco) Oil filling system ABB Robot controller ABB's Multi Panel Siemens HMI 	 Very little communication happens inside the architecture Data is not collected neither managed The automatized processes happen only between the robotic arm and the physical items Every other process is executed manually Processes do not make use of cloud 	YES

Table 3: Applicability study

7. Major research implications and future work

7.1. Conclusions

At the end of this applicability study, we have managed to answer all the research questions that we had at the start of the thesis. The evaluation of all possible state of the art solutions on the digitalization of discrete manufacturing solutions, showed the limitations and strong points of PADME but not only. The industry of discrete manufacturing is thriving with new solutions, each with its most innovative and strong point. What was noticed was that the implementation of cloud services and the centralized management of data is undiscussable and a must for every company in the domain of discrete manufacturing. The discussion on using cloud or local database seems rather outdated when there are companies that have developed and launched AI services and issue-fixing through machine learning. After the analysis of ABB's solution and the visits and observations at the reference company GKN, we concluded that the architecture proposed through PADME was totally applicable with the systems and processes of GKN.

7.1.1 Answers to the research questions

The first research question was about finding the state of the art solutions on digitalization in the discreet manufacturing domain. All the solutions were analyzed in the fourth section of the thesis and consisted in the fifteen architectures found in the related papers and the websites of the in real-life-implemented examples. The second research question, which was about identifying the characteristics and limitations of the proposed architectures, was answered throughout the section five, where the architectures are compared by their type and components in Table 1. The third research question, which seeks investigation about the applicability of ABB's solution, is answered in Section 6 and in Table 2, where the applicability is furtherly demonstrated and confirmed. After presenting the solutions developed by ABB Robotics via the project PADME, we investigated on the practicality of using the same architecture on GKN by keeping in mind the characteristics and limitations of the architecture. We envision that this evaluation together with comparisons of the digitalization architectures will serve as a guideline to manufactures on how to migrate to fully digitalized manufacturing using secure, reliable and predictable components in the architecture.

In Table 4, we summarize the results of this thesis work and the researched areas.

7.2. Limitations of the thesis work

During our thesis work, we faced several limitations that affected mostly the lack of access to the information about architectures and the overall difficulty in comparing components or protocols with each other. Protocols being evaluated differ in nature from each other, for example, we would not be able to say which is the best communication protocol out of JOpenShowVar and TCP/IP, since no research has been previously done to compare them based on factors such as bandwidth, latency, etc. A component can be more suitable and perform better in one architecture than another, due to the specific combinations and interactions of that system. Therefore, the lack of information was a common limitation we faced when trying not to make the investigation based on assumptions or the exaggerated features advertised on companies websites. This limitation can be seen in the evaluation of KUKA, since due to the lack of information we managed to schematically represent the architecture by our own based on what we understood from the few information that we could find in the papers. Furthermore, assessing the compatibility of PADME itself on was a limitation since it was difficult to determine the applicability of specific components regarding others. The same for the assessing languages of communication of the robots, very vague information is found online, and one is not able to access confidential information of companies in order to fully investigate, without being a direct collaborator of the company. The absence of a response from GKN negatively affected the thesis work, since it would have been the last reaffirmation of the investigation's results and would have furtherly shown the possible applicability of PADME to the full extent.

Researched areas	ABB's solution
Characteristics of the architecture	 Higher security than other systems since the system is not entirely web-based The 800xA of PADME is easily adaptable and applicable to any other architecture's needs A lot of existing architectures have already made use of cloud features The system's API features can help in the integration with other architectures Possibility of accessing CAD models according to the customer's need. Docker containers are more advanced than the Linux containers available in other architectures
Possible limitations of the architecture	 Cloud features not implemented yet The system supports only OPC-UA No official support for ROS systems, framework, messages No user-friendly interface ABB's closed systems and isolated programming language No cloud storage gateway No possibility to connect with AWS or Azure, crucial elements of enterprise nowadays No possibility of machine-learning and AI automated processes No knowledge-based automated problem fixing
Applicability	 ABB's solution can be applied at GKN 800xA can fit the needs of multiple kind of companies and domains OPC-UA offers multiple layers of security for processes Applicability offers SAAP and VAP Possible difficulty in being applied in small sized companies which are not aware of the benefits of visualization and analytics of processes and do not collect neither manage data. No information on the adaptation with Linux or Servlet containers, commonly used in the industry No information of the applicability in systems with their own cloud services Difficult to apply in system architectures that make use of ROS, this narrows down the range of applicability Partial compatibility in other systems due to the programming language of ABB robots and OPC-UA

Table 4: Researched areas and their results

7.3. Future work

Further investigation that would follow after this thesis work would be the evaluation of the selected solution of PADME by using simulation techniques to show the applicability of the solution for a specific feature in a selected reference company. Such simulation would need to be run with specific metrics according to the chosen architecture in the company, by reproducing the processes of discreet manufacturing so to be able to come up with results that could be properly evaluated through numerical comparison. As for the future work that could be done from the PADME team, the results of this investigation and the drawbacks that were summarized regarding PADME could be improved and a completely new and reimagined architecture could be conceived. The architecture would take into consideration the comments of our thesis work as well as the suggestions that were given about the architecture throughout the whole evaluation of the thesis.

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