# Monitoring and Diagnostics with Intelligent Agents Using Fuzzy Logic

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Abstract- Intelligent Agents have originated a lot of discussion about what they are, and how they are different from general programs. We describe in this paper a new paradigm for intelligent agents. This paradigm helped us deal with failures in an independent and efficient way. We proposed three types of agents to treat the system in a hierarchical way. A new way to visualize fault tolerant systems (FTS) is proposed, with the incorporation of intelligent agents, as they grow and specialize create the Multi-Agent System (MAS). The MAS contains a diversified range of agents, which depending on the perspective will be specialized or evolutionary (from our initially proposal) they will be specialized for the detection and possible solution of errors that appear in an FTS). The initial structure of the agent is proposed in [1] and named reflected agent with an internal state and in the Method MeCSMA [2]. The present work is based on the idea that with the help of the paradigm of intelligent agents, we may be able to handle fault tolerant systems, in the modality of embedded systems. The idea is to detect errors and to try to correct the failures that could happen in industrial control by monitoring and diagnosis.

*Index Terms*— Intelligent Agents, Fuzzy Logic, Monitoring, Diagnostics.

#### I. INTRODUCTION

At the present time the approach by means of agents for real applications, has worked with movable agents, which work at the level of the client-server architecture. However, in systems where the requirements are higher, as in the field of the architecture of embedded industrial systems, the idea is to innovate in this area by working with the paradigm of

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intelligent agents. Also, it is a good idea in embedded fault tolerant systems, where it is a new and good strategy for the detection and resolution of errors.

The main goals of the present research work were the following:

1 To create a new visualization tool of the application of the intelligent agents, in the fault tolerant systems in embedded systems.

To create a model, that helps the programmers to create profiles in the embedded circuits, according to utility, by means of, Intelligent Agents

The reflected agent with an internal state, of [3] Figure 1, sets out the general structure of the recovery Intelligent Agent for Fault tolerant Systems in Distributed Systems, whit three types of intention agents.

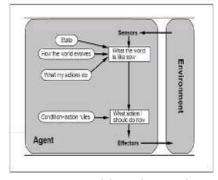


Figure 1 Agent with an internal state.

#### A. Agents

Let's first deal with the notion of intelligent agents. These are generally defined as "software entities" which assist their users and act on their behalf. Agents make your life easier, save you time, and simplify the growing complexity of the world, acting like a personal secretary, assistant, or personal advisor, who learns what you like and can anticipate what you want or need. The principle of such intelligence is practically the same of human intelligence. Through a relation of collaborationinteraction with its user, the agent is able to learn from himself, from the external world and even from other agents, and consequently act autonomously from the user, adapt itself to the multiplicity of experiences and change its behavior according to them. The possibilities offered for humans, in a world whose complexity is growing exponentially, are enormous [1], [4], [5], [6].

# B. Multi-Agent Systems

In artificial intelligence research, agent-based systems technology has been hailed as a new paradigm for conceptualizing, designing, and implementing software systems. Agents are sophisticated computer programs that act autonomously on behalf of their users, across open and distributed environments, to solve a growing number of complex problems. Increasingly, however, applications require multiple agents that can work together. A multi-agent system (MAS) is a loosely coupled network of software agents that interact to solve problems that are beyond the individual capacities or knowledge of each problem solver.

Advantages of a Multi-Agent Approach An MAS has the following advantages over a single agent or centralized approach:

- An MAS distributes computational resources and capabilities across a network of interconnected agents. Whereas a centralized system may be plagued by resource limitations, performance bottlenecks, or critical failures, an MAS is decentralized and thus does not suffer from the "single point of failure" problem associated with centralized systems.
- An MAS allows for the interconnection and interoperation of multiple existing legacy systems. By building an agent wrapper around such systems, they can be inporporated into an agent society.
- An MAS models problems in terms of autonomous interacting component-agents, which is proving to be a more natural way of representing task allocation, team planning, user preferences, open environments, and so on.
- An MAS efficiently retrieves, filters, and globally coordinates information from sources that are spatially distributed.
- An MAS provides solutions in situations where expertise is spatially and temporally distributed.
- An MAS enhances overall system performance, specifically along the dimensions of computational efficiency, reliability, extensibility, robustness, maintainability, responsiveness, flexibility, and reuse [3].

## II. DISTRIBUTED ARTIFICIAL INTELLIGENCE

Distributed Artificial Intelligence (DAI) systems can be defined as cooperative systems where a set of agents act together to solve a given problem. These agents are often heterogeneous (e.g., in Decision Support System, the interaction takes place between a human and an artificial problem solver).

Its metaphor of intelligence is based upon social behavior (as opposed to the metaphor of individual human behavior in classical AI) and its emphasis is on actions and interactions, complementing knowledge representation and inference methods in classical AI.

This approach is well suited to face and solve large and complex problems, characterized by physically distributed reasoning, knowledge and data managing. In DAI, there is no universal definition of agent, but Ferber's definition is quite appropriate for drawing a clear image of an agent: "An agent is a real or virtual entity which is emerged in an environment where it can take some actions, which is able to perceive and represent partially this environment, which is able to communicate with the other agents and which possesses an autonomous behavior that is a consequence of its observations, its knowledge and its interactions with the other agents".

DAI systems are based on different technologies like, e.g., distributed expert systems, planning systems or blackboard systems. What is now new in the DAI community is the need for methodology for helping in the development and the maintenance of DAI systems. Part of the solution relies on the use of more abstract formalisms for representing essential DAI properties (in fact, in the software engineering community, the same problem led to the definition of specification languages) [7] [8].

## III. PROPOSED METHOD

Be a Distributed System (mainly applied to the industrial control), which this made up of a set of Nodes, where each one of them can be constituted by several Devices.

On these Nodes a set of Tasks, ordered is executed all of them to take I finish the functionality of the system. In order to identify this Distributed System the following definitions set out:

Definition 1: = is N {Nor}, the set of the Nodes of the system, being n is the number of units that integrate it.

Definition 2: Be [Di, z], the set of devices that contains Node i. Where z can take value 1, if it is wanted to see the Node like only device, or greater than 1 if it is desired to do visible some of the elements that integrate it.

Definition 3: = is T  $\{T \}$ , the set of tasks that are executed in the system, being t the number of tasks that integrate the system.

Definition 4: A System Distributed like dupla is defined: SD = (N, T) Once characterized what a Distributed System could be denominated Basic (without no characteristic of Tolerance to Failures), is going away to come to the incorporation on he himself from the paradigm of Intelligent Agents with the purpose of equipping it with a layer with Tolerance to Failures. The Fault tolerant Agents will define themselves now that worked in the SD

Definition 5: An Agent is ANi to whom Agent denominated itself Node, whose mission is the related one to the tolerance to failures at level of the Node Nor. An Agent exists therefore Node, by each Node of the System (biyectiva application).

Definition 6: An Agent is ATj to whom Agent denominated itself Task, whose mission is the related one to the tolerance to failures at level of the Tj Task. An Agent exists therefore Task by each task of the system.

Definition 7: An Agent is AS to whom Agent denominated itself to him System, whose mission is the related one to the tolerance to failures system level.

Definition 8: AN= {ANi} the set of all the Agents Node.

Definition 9:  $AT = \{ATj\}$  the set of all the Agents Task.

Definition 10: A System is SMATF Fault tolerant Multi-Agent, formed by tripla of ANi, ATj, AS.

That is to say, SMATF =  $\langle Ni, AT j, AS \rangle$  with it a Distributed System Fault tolerant SDTF is defined as:

Definition 11: A Distributed System Fault tolerant SDTF like dupla SDTF is defined SDTF =<SD, SMATF > Next goes to describe with greater detail each one of the Agents who compose the SMATF [9], [10].

#### IV. IMPLEMENTATION OF THE APPROACH

We have implemented the intelligent agents using the MATLAB programming language. The reason for using this programming language is that it is very easy to develop prototypes. At the beginning the implementation was done with traditional Boolean logic. In other words, the if-then rules of the agent were considered as categorical (as in an ideal situation with no uncertainty). We show in Figure 6 the implementation in MATLAB of one of the intelligent agents with categorical if-then rules. In a second phase, we consider using fuzzy logic to model uncertainty in the decision process. In this case, the knowledge base consists of fuzzy rules. We show in Figures 7 and 8 the implementation in MATLAB of the fuzzy rules of an intelligent agent.

#### % AGENTE SISTEM A

%Detection
if AS .Phase .Detection && AN(i).SPhase . operation free of
errorLocalitation
end
if AS .Phase .Detection && ATjS .In execution
free of error
end
if AS .Phase Detection && ATj.Down
toterminatethedeviceoffhenode && AS Phase Reconfiguration
end
if AS .Phase Detection && ATjS .State .S oftware .Error
ASNi.Function.deteted Error. ASTj.lengthy.execution &&
AS.Phase.Location
if AS .Phase Detection && ATjS .State .Hardware Error
ASNi.Function.deteted Error.
AST).lengthy.execution &&
AS .Phase.Location
end
if AS.PhaseDetection && ATj.Degraded
toterminatethedeviceoffhenode && AS.Phase.Reconfiguration
end
%Location
if AS .Phase .Location &&ANiS .undersecovery
AS .Phase .Is olation
end
% Isolation
if AS.Phae.Isolation ANiS.Conect.State
AS .Phase Recovery
end CAR Frank Labor ANCE Deven State
if AS. Phae. Is olation ANIS. Down. State
AS .Phase Reconfiguration end
ena if AS.Phae.Isolation ANiS.Degraded.State
II AS .Fnae.Bolation ANIS .Degraded.State AS .Phase Reconfiguration
A5.Frase Recomputation
% Reconfiguration
if AS. Phase. Reconfiguration && ANi.State. Down o Degraded
AS Phase . Recovery
end
% Recovery
if AS.Fase.Recovery && ASTj.EjecucionReconRecu
AS Plase Detection
end

Fig. 6 Knowledge base of the intelligent agent.

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Fig. 7 Fuzzy system structure of the intelligent agent.

```
a=newfis('reglasdifusas');
a.input(1).name='error';
a.input(1).range=[0 1];
a.input(1).mf(1).name='bajo
a.input(1).mf(1).type='trapmf
a.input(1).mf(1).params=[-0.25 0 0.2
0.5];
a.input(1).mf(2).name='medio';
a.input(1).mf(2).type='trimf
a.input(1).mf(2).params=[0.2 0.5 0.8];
a.input(1).mf(3).name='alto';
a.input(1).mf(3).type='trapmf
a.input(1).mf(3).params=[0.5 0.8 1
1.121;
a.output(1).name='nodo';
a.output(1).range=[0 1];
a.output(1).mf(1).name='Baja
a.output(1).mf(1).type='trapmf';
a.output(1).mf(1).params=[-0.25 0 0.1
0.4];
a.output(1).mf(2).name='Degradado';
a.output(1).mf(2).type='trimf';
a.output(1).mf(2).params=[0.2 0.5 0.8];
a.output(1).mf(3).name='OK';
a.output(1).mf(3).type='traps
a.output(1).mf(3).params=[0.6 0.9 1
1.251:
a.rule(1).antecedent=[1];
a.rule(1).consequent=[3];
a.rule(1).weight=1;
a.rule(1).connection=2;
a.rule(2).antecedent=[2];
a.rule(2).consequent=[2];
a.rule(2).weight=1;
a.rule(2).connection=1;
a.rule(3).antecedent=[3];
a.rule(3).consequent=[1];
a.rule(3).weight=1;
a.rule(3).connection=2
fuzzv(a)
```

Fig. 8 Fuzzy rule base implementation of the agent.

# V. SIMULATION RESULTS

We show in this section the simulation results of the intelligent agent that was implemented in MATLAB. We show results of two different fuzzy models used in the intelligent agents, one of Mamdani form and the other in Sugeno style. First, we show the results of the Mamdani fuzzy model in Figures 9, 10, 11, 12, and 13. In Figure 9 we show the use of the rule viewer of the MATLAB fuzzy logic toolbox to test the fuzzy rules. In Figures 10 and 11 we show the membership functions used in the fuzzy rules. In Figure 12 we show the non-linear surface of the fuzzy system. In Fig. 13 we show the fuzzy rules for the error

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File Ed	dit View Options		
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1			
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Fig. 9 Rule viewer to test the fuzzy system.

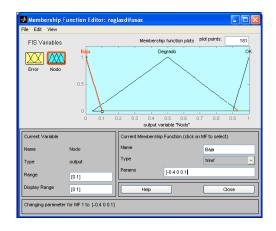


Fig. 10 Output membership functions.

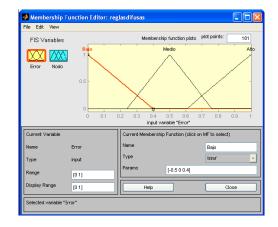


Fig. 11 Input membership functions.

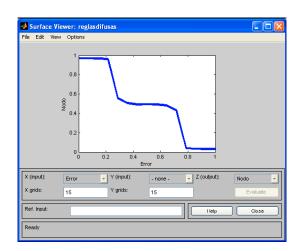


Fig. 12 Non-linear surface of the fuzzy system.

🛃 Rule Editor: reglasdifusas	
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1. If (Error is Bajo) then (Nodo is OH) (1) 2. If (Error is Medio) then (Nodo is Ceyrado) (1) 3. If (Error is Ato) then (Nodo is Baja) (1)	
If Error is Addition and Alto none	Then Nodo is Baja Degrado Ok none
Connection Weight: or and 1 Delete rule Add rule Change rule	<< >>
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Fig. 13 Fuzzy rules of the system.

Now we show the results of the Sugeno fuzzy model in Figures 14, 15, 16, 17, 18 and 19. In Figure 14 we show the structure of the Sugeno fuzzy model. In Figure 15 we show the use of the rule viewer of the MATLAB fuzzy logic toolbox to test the fuzzy rules. In Figure 16 we show the non-linear surface of the fuzzy system. In Figure 17 we show the membership functions used in the fuzzy rules. In Fig. 18 we show the constant output values of the Sugeno model. In Figure 19 we show the fuzzy rules for the error in monitoring the process. The simulation results of the Sugeno fuzzy model are better than the results of the Mamdani model and it is selected as the better option for this problem of monitoring and diagnostics

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Fig. 14 General structure of the Sugeno model.

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Fig. 15 Use of the rule viewer to test the system.

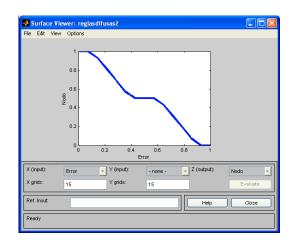


Fig. 16 Non-linear surface of the fuzzy system.

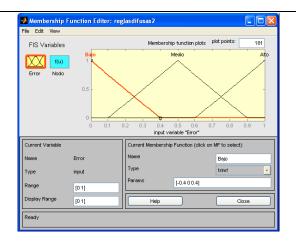


Fig. 17 Input membership functions of the system.

Membership Function	n Editor: reg	las difusas 2				
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		ок				
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output variable "Nodo"						
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Display Range		Help	Close			
Selected variable "Nodo"						

Fig. 18 Constant output values of the rules.

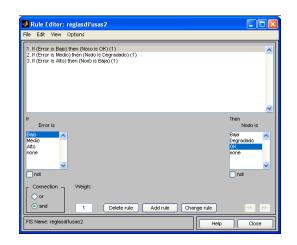


Fig. 19 Rules of the fuzzy Sugeno model.

## VI. CONCLUSIONS

We described in this paper our approach for building multiagent systems for achieving fault tolerant control system in industry. The use of the paradigm of intelligent agents has enabled the profile generation of each of the possible failures in an embedded industrial system. In our approach, each of the intelligent agents is able to deal with a failure and stabilize the system in an independent way, so that the system has a behavior that is transparent for the application as well as for the user. An intelligent agent with fuzzy logic is able to monitor and make diagnosis of possible problems in the process.

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