

# Implementation of Human Perception in Mobile Robots with Fuzzy Logic for Collision Avoidance

Bashra Kadhim Olewi<sup>1</sup>

<sup>1</sup> University of Siegen

*Received: 12 February 2015 Accepted: 28 February 2015 Published: 15 March 2015*

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## Abstract

With ever increasing complexities and associated dangers of Industrial processes and activities, a major endeavor have been focused in automating the industrial process and activities and reduce human interactions and thus eradicating the associated dangers. Ever since, a heuristic effort have been concentrated in replacing human with robots due to their ability to perform tasks repeatedly, quickly, accurately and without fatigue. Autonomous Mobile Robots, for a long time, have remained in the spotlight of researches due to its potentials in multifunctional applications and its suitability in such industrial applications. However, the key features like path planning and motion planning of Autonomous Mobile Robots needs to have further development before they can be effectively and successfully used in highly dynamic environments, such as, Industrial Environments. This paper addresses the collision avoidance problem within Motion Planning and provides an innovative way, by implementing Human Perception using Fuzzy Inference System, for tackling this problem. The viability and acceptability of the design have been demonstrated by carrying out MATLAB simulations in 2D environments. And to verify the credibility, simulation results have been provided which further ensures the design meets its desired goals.

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**Index terms**— multi-robot motion planning, multi objective optimization, obstacle avoidance, genetic algorithm, a\* search algorithm, fuzzy logic, mamdani fuzzy logi

## 1 I. Introduction

s Mobile Robots are becoming popular and their wide range of probable applications are being explored, more and more researches are being carried out to eradicate the incapability of Mobile Robots and make them suitable for different situations and applications. Mobile Robots can have multidimensional functionalities or might be used in various different applications. Different application will demand different application specific functionalities, however one of the most basic and important functionality and fundamental requirement of all Mobile Robots would be to safely navigate from one location to another and then perform its respective tasks. Thus, one of the key fields of research now-a-days has been the path planning of mobile robots, which would ensure the Mobile Robots to safely navigate from its initial location to its final location. However, the word "SAFELY" is of great significance as Author ? ? ? : University of Siegen/Automatic Control Engineering, D-57068 Siegen, Germany. e-mails: bashra.kadhim@uni-siegen.de, asif.mahfuz@student.uni-siegen.de, Hubert.roth@uni-siegen.de it encompasses complex collision avoidance strategies and many other complex algorithms for various features. Therefore, the task of Mobile Robots to successfully navigate through the environments depends largely upon how much effective and flexible path planning and collision avoidance algorithm it uses.

On the other hand, a parallel field of interest for many researchers around the world has been the understanding of the human mind and its intelligence. This is because unraveling the mystery of human intelligence, which encompasses complex reasoning, problem solving, decision making and knowledge processing, can be the panacea

43 to the sea of complex problems which are hindering the technological advances. Introducing perceptual judgement,  
44 intelligent decision making or experience based learning to robots, vehicle or any other devices can give them the  
45 intelligence to overcome complex hurdles. The aim of this work is to mimic human perceptual judgment with a  
46 Fuzzy Inference System in Mobile Robots for a robust collision avoidance algorithm.

## 47 2 II. Problem Formulation

48 The current work is an improvement of the approach proposed in the work [1]. The scope of the work is strictly  
49 restricted to environments with known static obstacles and more than one (two) Mobile Robots. In addition,  
50 the work is based on the following assumptions, firstly, a continuous metric map of the environment is available  
51 to the Mobile Robots, and secondly, each Mobile Robots have the exact location information of itself and the  
52 other Mobile Robot. This work of motion planning and control basically comprised of two phases. In the first  
53 phase, individual multi-objective optimized paths were generated with specific cost functions for individual Mobile  
54 Robots the consideration of the other Mobile Robots in the environment, with.

55 Modified Genetic Algorithm with A\* [2]. Although, neglecting the other Mobile Robots reduced complexity  
56 of the task of individual path planning for the Mobile Robots, but it generated paths which would intersect with  
57 the paths of the other Mobile Robots. This as a result increased the probability of collisions. Thus, if such a  
58 situation occurs, an algorithm was needed to avoid collisions of the Mobile Robots. The second phase of the work  
59 therefore, was to design a method to avoid such collisions. In the second phase, a Fuzzy Inference System was  
60 designed to safely avoid the collision by slowing down the low prioritized Mobile Robot. Although this approach  
61 provided successful outcomes and was appropriate for some applications, but it also had an inflexibility. In worst  
62 cases, if the prioritized robot breaks down in the intersection point for any technical or other problems, the  
63 second, low prioritized Mobile Robot, will also stop keeping a safe distance from the other Mobile Robot and  
64 does not have the intelligence to drive around the broken Mobile Robot to avoid the collision and complete its  
65 due tasks. Fig. ?? : A) "Situation 1" where both Mobile Robots approach the intersection at the same time and  
66 B) "Situation 2" where the prioritized Mobile Robot breaks down in its path.

67 Figure ?? above depicts the two situations where the Mobile Robots have possibilities of collision. The earlier  
68 designed approach was able to tackle "Situation 1" and both Mobile Robots can effectively carry out their  
69 respective tasks. However, in "Situation 2" the low prioritized Mobile Robot would stop keeping a safe distance  
70 from the prioritized Mobile Robot, but was unable to independently carry out its task unless and until the  
71 prioritized Mobile Robot was moved out of its track. This inflexibility demanded an improved strategy, which  
72 would help the Mobile Robot to avoid collisions and as well as overcome such situations and carry out its task  
73 independent of the state of the prioritized Mobile Robot. The alternative design approach proposed in this paper,  
74 is the implementation of mimicked human perceptual judgments with the help of a Fuzzy Inference System for  
75 collision avoidance. However, to facilitate the mapping of human mind reasoning in to computation processes  
76 would require the understanding of step-bystep formulation of human perceptual judgments. So, to apprehend  
77 the design process and the design, the next section gives a narrowed down and general description of human  
78 path planning and perceptual judgements specific to our application. As soon as people make up their mind,  
79 the human mind takes into account, its current position, destination location, knowledge and experience of the  
80 place and curves out a path to reach the destination location. So, if the situation remains as it was planned, the  
81 preplanned path is taken to reach the destination location. However, if there are any problems or obstacles in the  
82 planned path human mind based on perceptual judgements, make instantaneous decisions to take an alternative  
83 route or to avoid the obstacle. Since the focus of this is based on collision avoidance with dynamic obstacles, a  
84 deeper effort is taken to understand how human perceives an object to be an obstacle in its way.

## 85 3 III. Understanding of the Human Mind

86 Firstly, the simplest case can be an object stranded on the preplanned path, which has to be avoided. Second  
87 case can be a moving object in the proximity of human vision. As soon as the moving object is noticed, based on  
88 individual perception and not precise or accurate data, human mind decides about the proximity of the object,  
89 in other words their distance Although the process of decision making and perceptual judgment might seem very  
90 simple, as human use it instinctively, but to understand the process behind it can be equally complex and hectic.  
91 Thus, to decrease the degree of complexity in understanding the human mind, the scope of human intelligence  
92 is narrowed down to the interpretation of perceptual judgement within our specific application. Therefore, in  
93 other word, we would try to investigate deeply how humans plan their path to safely move from one location to  
94 another. Figure 2 shows a simple block diagram to describe the process of how human mind works when people  
95 make up their mind to go from one location to another. from the object is defined with perceptual judgment  
96 as, for instance, far, very far, near or very near etc. However, this degree of perceptual judgment is unique and  
97 subjective to individuals. Simultaneously, the human mind also figures out if the object is approaching or moving  
98 away. And if it is approaching, again based on perception, human mind decides how fast or slow it is moving.  
99 Based on such perceptual judgments (for the case of simplicity, the measure of the individual's physical ability  
100 has been ignored to reach the perceptual judgments), the human mind finds out an appropriate way of avoiding  
101 the collision with object. And once the object is avoided, and if there are no further distractions, the individual  
102 carries on following the preplanned path.

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103 The proposed approach is designed keeping an analogy to the human mind. Figure 3 As illustrated in the  
104 block diagram above, an initial set of parameters such as, speed and angle are calculated for the Mobile Robot  
105 based on the preplanned path and forwarded as the input to the Motion Controller. However, these are not the  
106 only inputs to the Motion Controller, based on the perceptual situation of the obstacle robot, an offset to the  
107 angle is also calculated by the Fuzzy Inference System and forwarded as an input to the controller. Therefore,  
108 the offset, generated by the Fuzzy Inference System, acts as the analogous instantaneous decision for the Mobile  
109 Robots to deviate from its original preplanned path and take an alternative way to avoid the solution. The  
110 proceeding section describes in details the design of the Fuzzy Inference System and how it calculates the offset  
111 value.

## 112 4 IV. Fuzzy Inference System

113 The Fuzzy Inference System designed, comprises of four inputs and one output. The inputs are Distance (distance  
114 between the two robots), CD (change in distance between the two robots), S (deviation from the preplanned  
115 path), and CS (change in deviation), and the output is Offset (amount of angle needed to be changed). As  
116 already depicted in Figure 5, the distance between the two robots are calculated at each time instants. The  
117 figure also gives an idea that the distance between the two Mobile Robots changes as the Mobile Robots move  
118 along their planned path. This change is calculated simultaneously and forwarded to the FIS as an input. This  
119 particular input helps the Mobile Robot to perceive whether, the other Mobile Robot (Robot 2) is approaching  
120 or retreating it. When CD is negative, the Mobile Robot (Robot 1) perceives the other Mobile Robot (Robot  
121 2) to be approaching it, and on the other hand when CD is positive, the Mobile Robot (Robot 1) perceives the  
122 other Mobile Robot (Robot 2) to be retreating it. In addition, the two other inputs S and CS are also calculated  
123 in a similar way. The input S is the deviation of its current position from the planned position. This helps the  
124 particular Mobile Robot to perceive, how far it has currently deviated from its planned path. Finally the input  
125 CS helps the Mobile Robot to perceive, whether it is currently moving away or approaching towards its planned  
126 path. These four inputs of the FIS altogether, contributes in perceiving the current situation around the Mobile  
127 Robot and thus, based on the perceptual judgment, it produces an output OFFSET. The output as the name  
128 suggests, is the offset which is added to the angle calculated and thus helping the Mobile Robot to deviate from or  
129 move towards the planned path. The following figures illustrate the universe of discourse of the inputs Distance,  
130 CD, S and CS respectively. The perception of Human being is basically the interpretation of a situation and each  
131 rule above define a particular situation and a judgment or output for it and in the process help to implement  
132 the concept of perception. There are altogether fifteen rules, which relates the input membership functions to  
133 the output membership functions, depicting different situations and their corresponding output. The figure 10  
134 below illustrates the universe of discourse for the output Offset. The proceeding section, gives the detailed results  
135 based on the simulation of the two situations discussed above and thus will verify the credibility of the proposed  
136 design.

## 137 5 V. Simulation Results

138 To carry out the validation of the entire design a simulation based on MATLAB in a 2D environment was carried  
139 out. The environment consisted of known static obstacles which represents a known industrial environment and  
140 two Mobile Robots which are to travel from their initial locations to their final locations. To verify the flexibility  
141 of the entire design, similar simulations were carried out in different maps. However, the results provided in this  
142 particular paper are from one of the maps on which the design was simulated. Figure 11 Figure 13 and Figure 14  
143 depict the change in trajectory followed between the initial planning and the actual path followed by the Mobile  
144 Robot. The changes are due to the instantaneous perceptual judgement made by the Mobile Robot due to the  
145 presence of another Mobile Robot in its proximity. Figure 13 and Figure 14 A) particularly show the path taken  
146 by Mobile Robot 1, in red dots, to avoid collision with Mobile Robot 2. Figure 13 and Figure 14 B) show that  
147 the distance between the two robots do not become zero, which in turn assure that the robots have maintained a  
148 safe distance between them to avoid collisions. Figure 13 and Figure 14 C) show the speed profile, which show an  
149 increase in time for the completion of task. This is particularly due to the increase in distance travelled compared  
150 to the travelling distance of the planned path. And finally, Figure 13 and Figure 14 Figure 15 and Figure 16  
151 show the X and Y coordinates of both the Mobile Robots for Situation 1 and Situation 2 respectively. In Figure  
152 15 and Figure 16 coordinates become equal at different time to when the Y coordinates become equal. Therefore  
153 from the above observation, it can be further deduced that the position of the Mobile Robots do not intersect  
154 with each other and hence do not collide. And so from the above results it can be concluded the design approach  
155 successfully meets its desired requirements.

## 156 6 VI. Conclusion and Suggestion for

157 Future Work

158 Collision Avoidance being one of the fundamental problems for Mobile Robots, this paper tries to address this  
159 problem and also provide a novel solution of tackling this problems. A collision avoidance mechanism, designed  
160 with Fuzzy Inference System and based on the idea of mimicking human perception is being presented in this  
161 paper. The scope of this work is particularly intended for Mobile Robots working within structured, known

## 6 VI. CONCLUSION AND SUGGESTION FOR

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162 environments with known static or dynamic obstacles. In order to verify the credibility of the design, simulations  
163 were carried out in a 2D environment in two different situations. The results from situation one, clearly depicts  
164 that both the Mobile Robots were able to successfully avoid collision in both the situations and complete their  
165 respective tasks. Whereas, the results from the second situation depicts, that, despite one of the Mobile Robot-2  
166 was stranded in the path of the other Mobile Robot-1, Mobile Robot-1 could still avoid collision and complete its  
167 tasks. And so, it can be concluded, that the design perfectly overcomes the problem of collision situations defined  
168 in this paper. As future work, this work can be extended: 1) To develop the FIS design to give better responses  
169 in terms of getting back to its path once the collision is avoided. 2) To change, add or alter the input parameters  
170 of the FIS to improve the results of perceptual judgment. 3) To solve the problem of collision avoidance of Mobile  
Robots with unknown dynamic or static obstacles with in the environment. <sup>1 2</sup>



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Figure 1: Fig. 2 :

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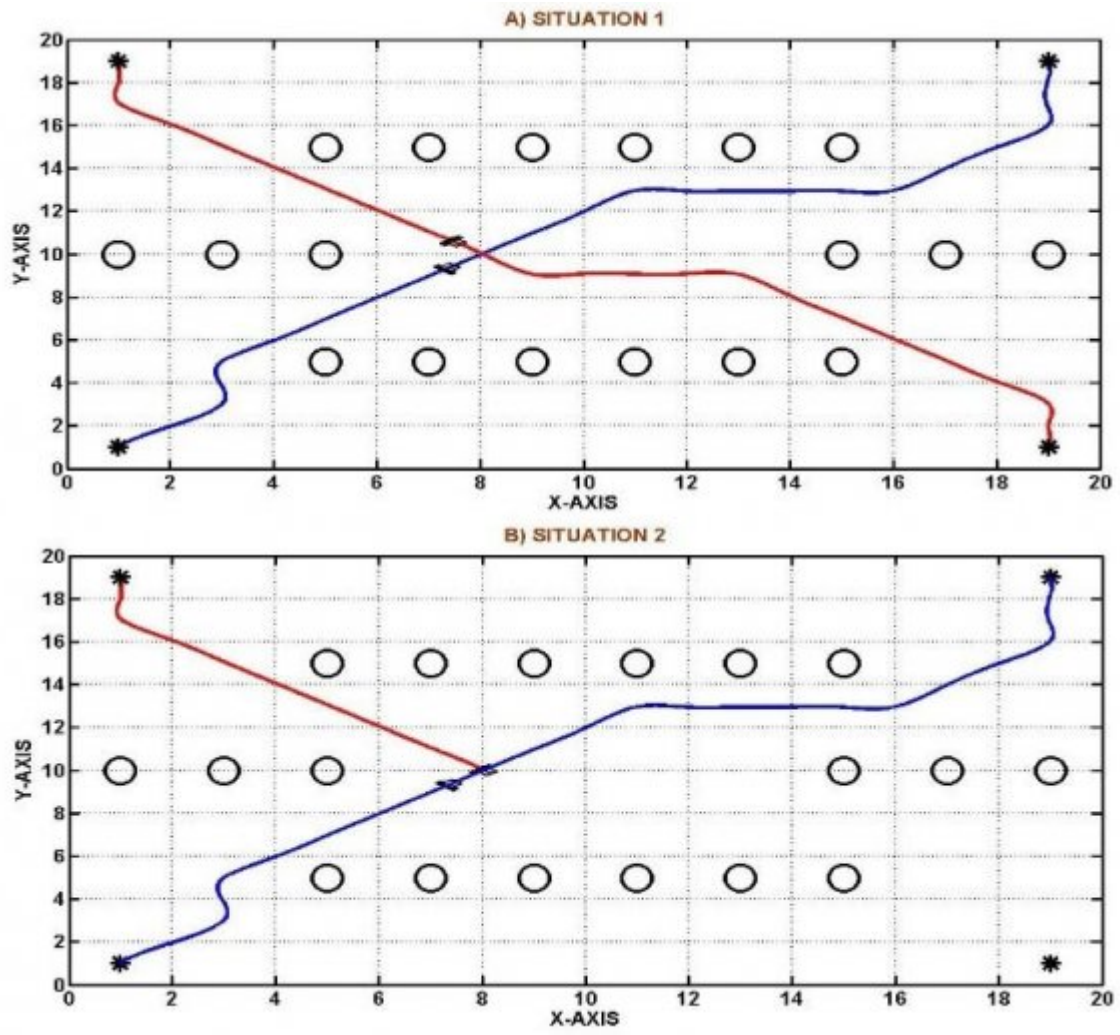


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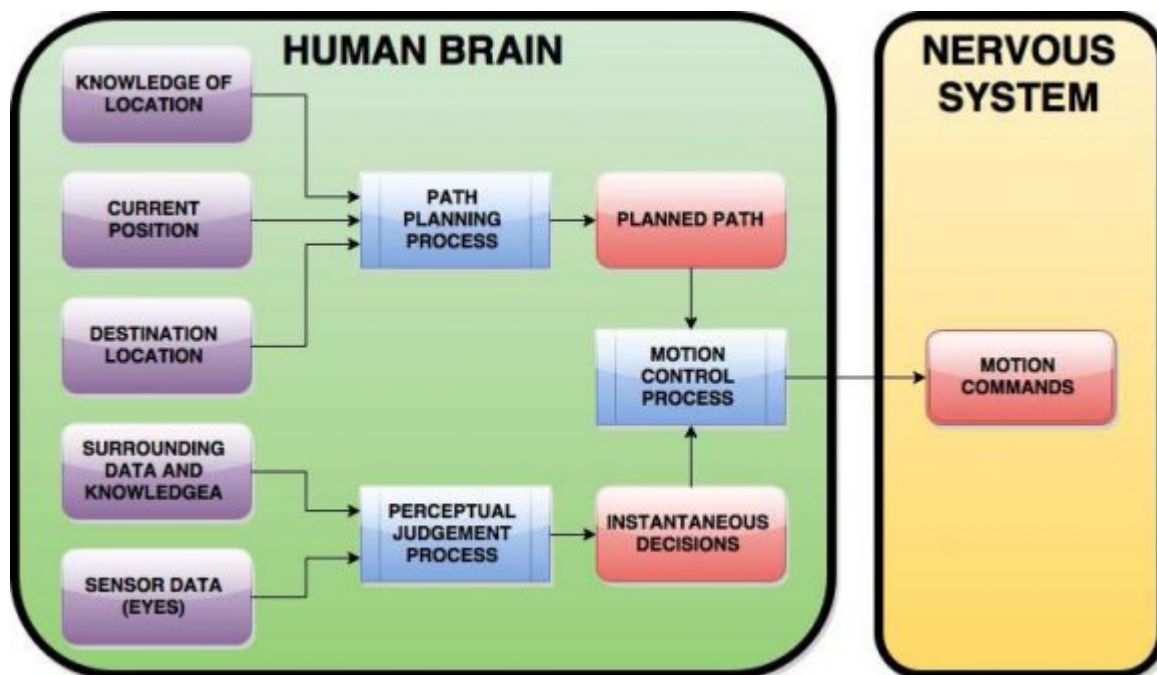
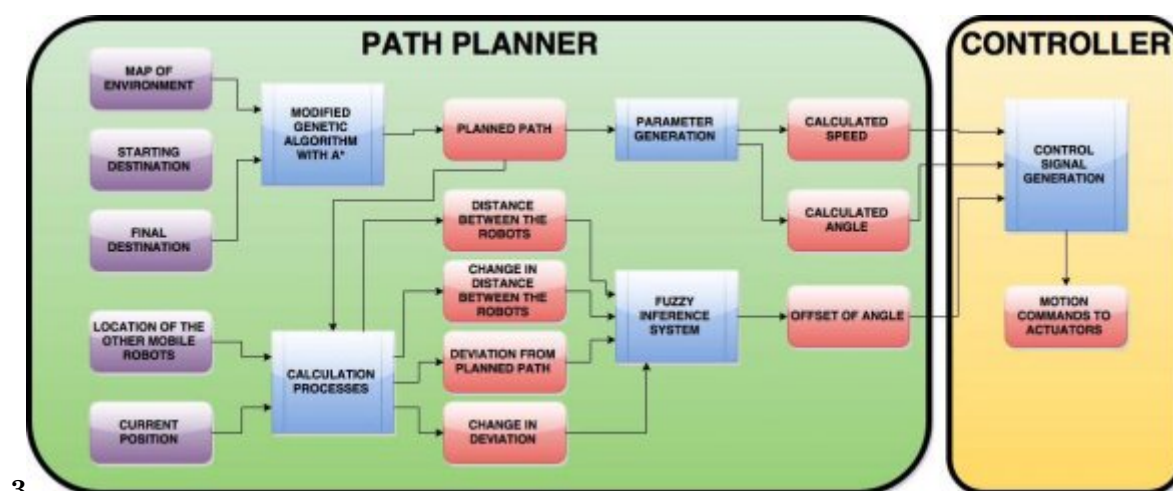
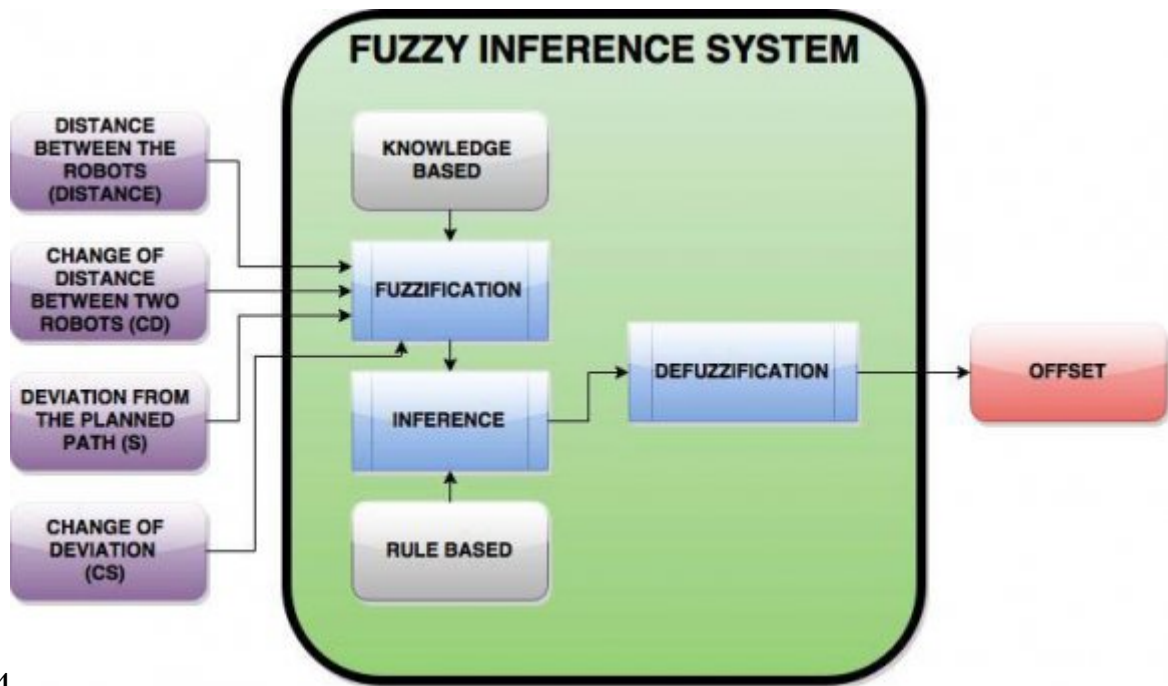


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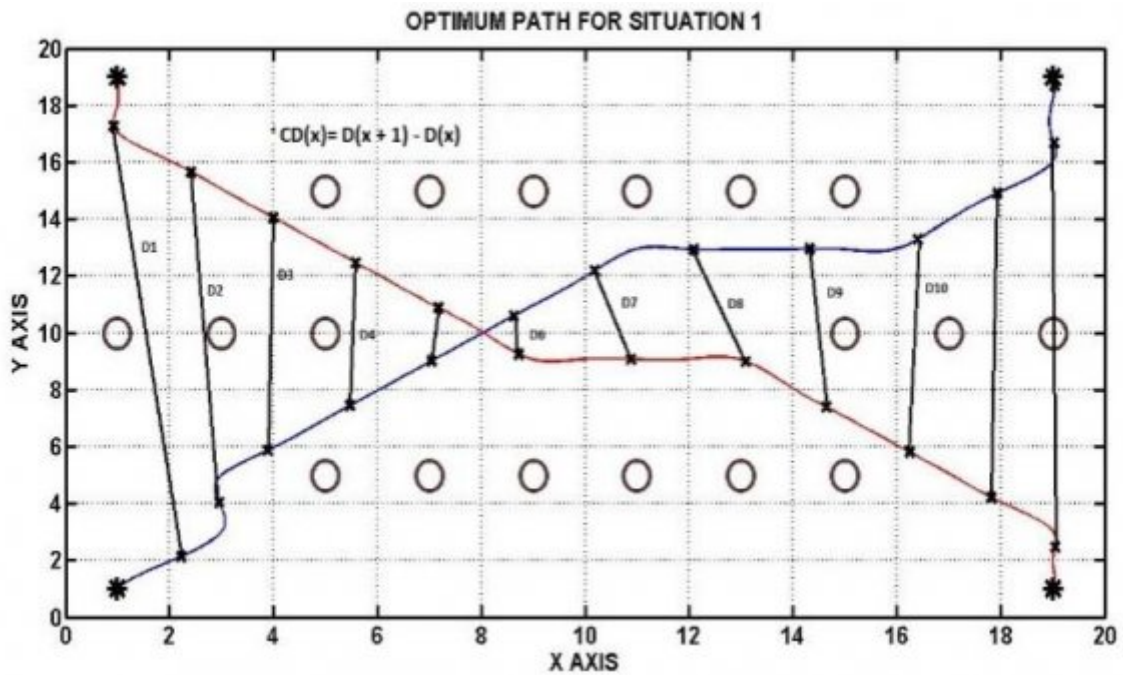
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Figure 4: Fig. 3 :



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Figure 5: Figure 4



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Figure 6: Fig. 4 :

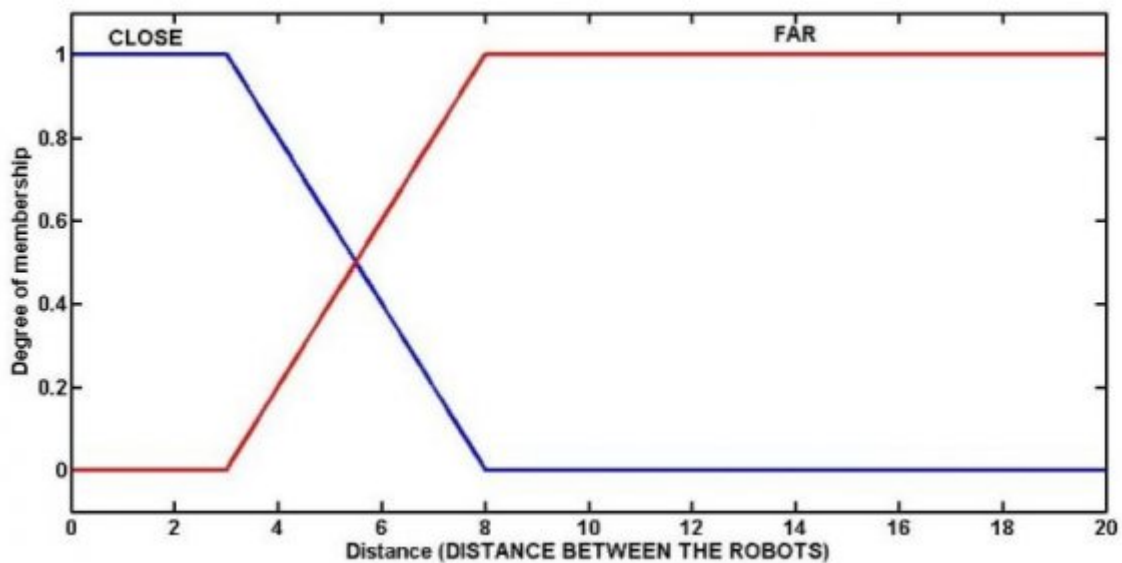
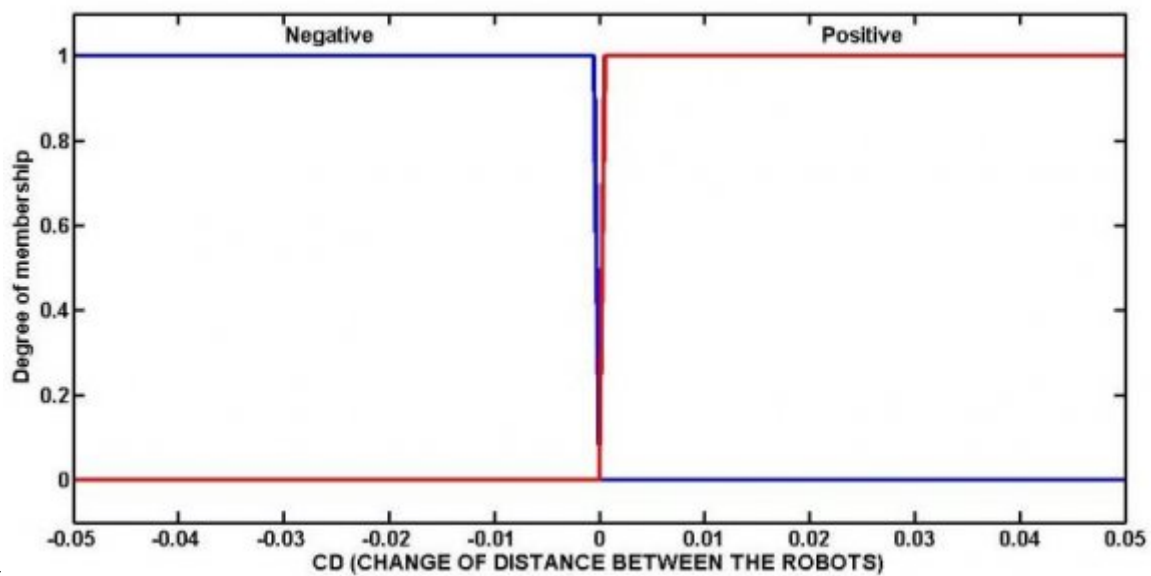
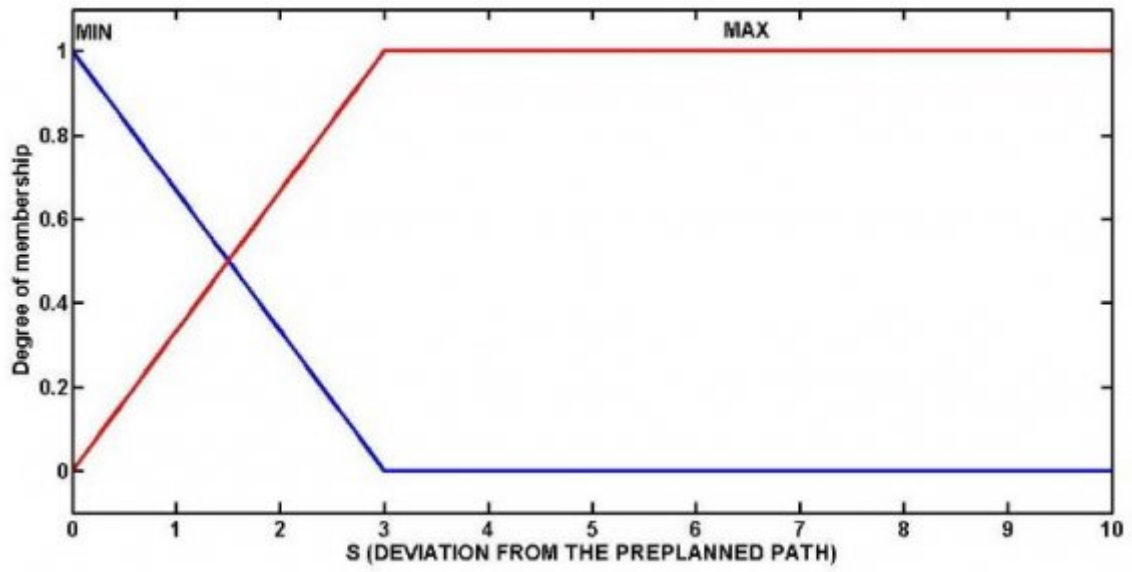


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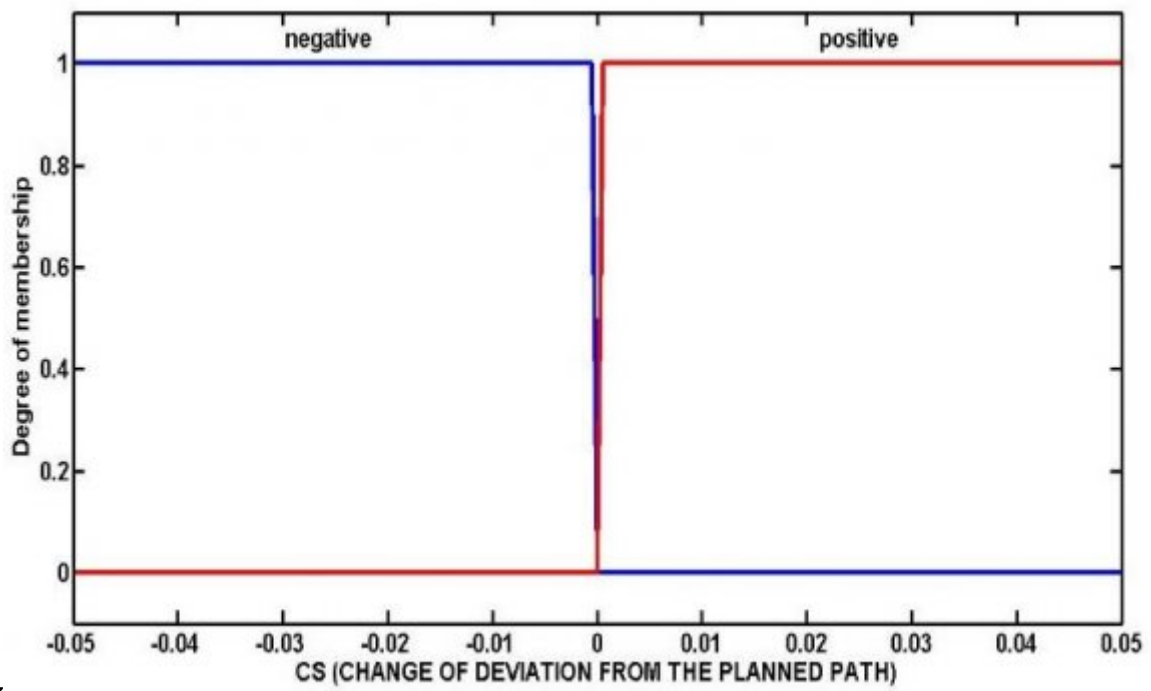
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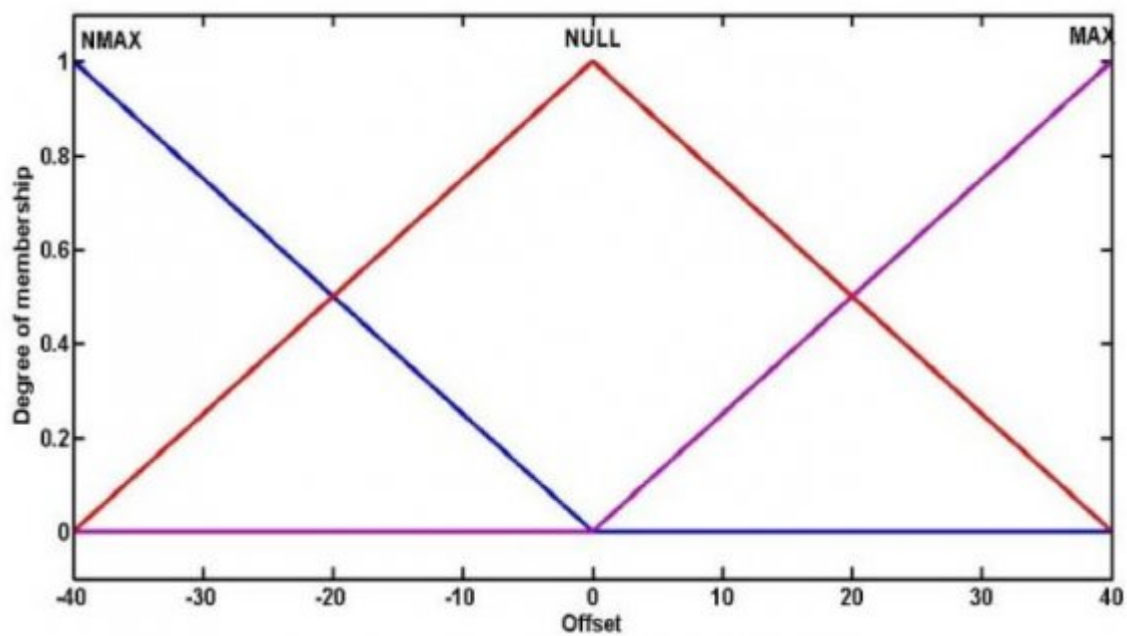
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Figure 9: Fig. 6 :



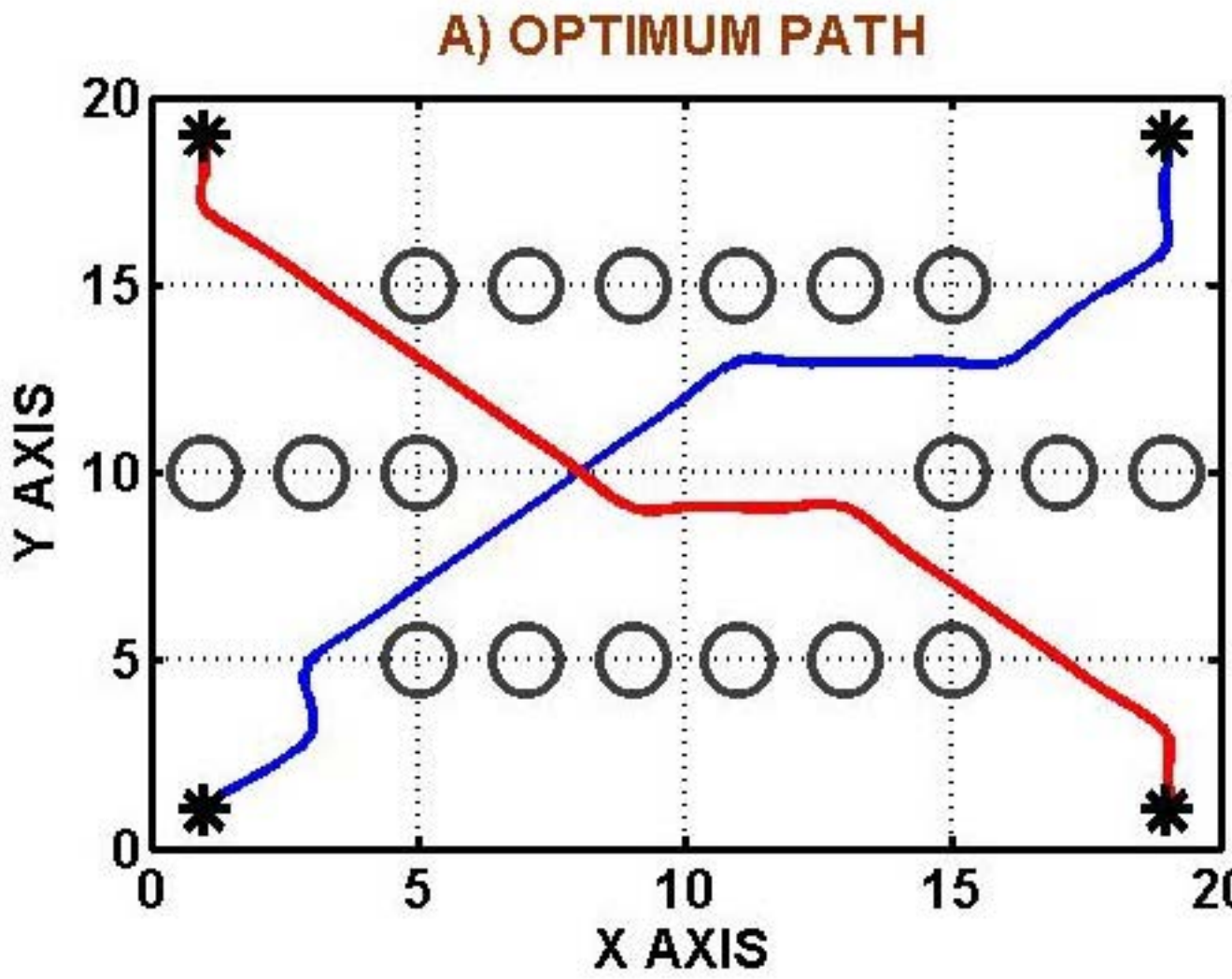
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Figure 10: Fig. 7 :



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Figure 11: Fig. 8 :Fig. 9 :



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Figure 12: Fig. 10 :

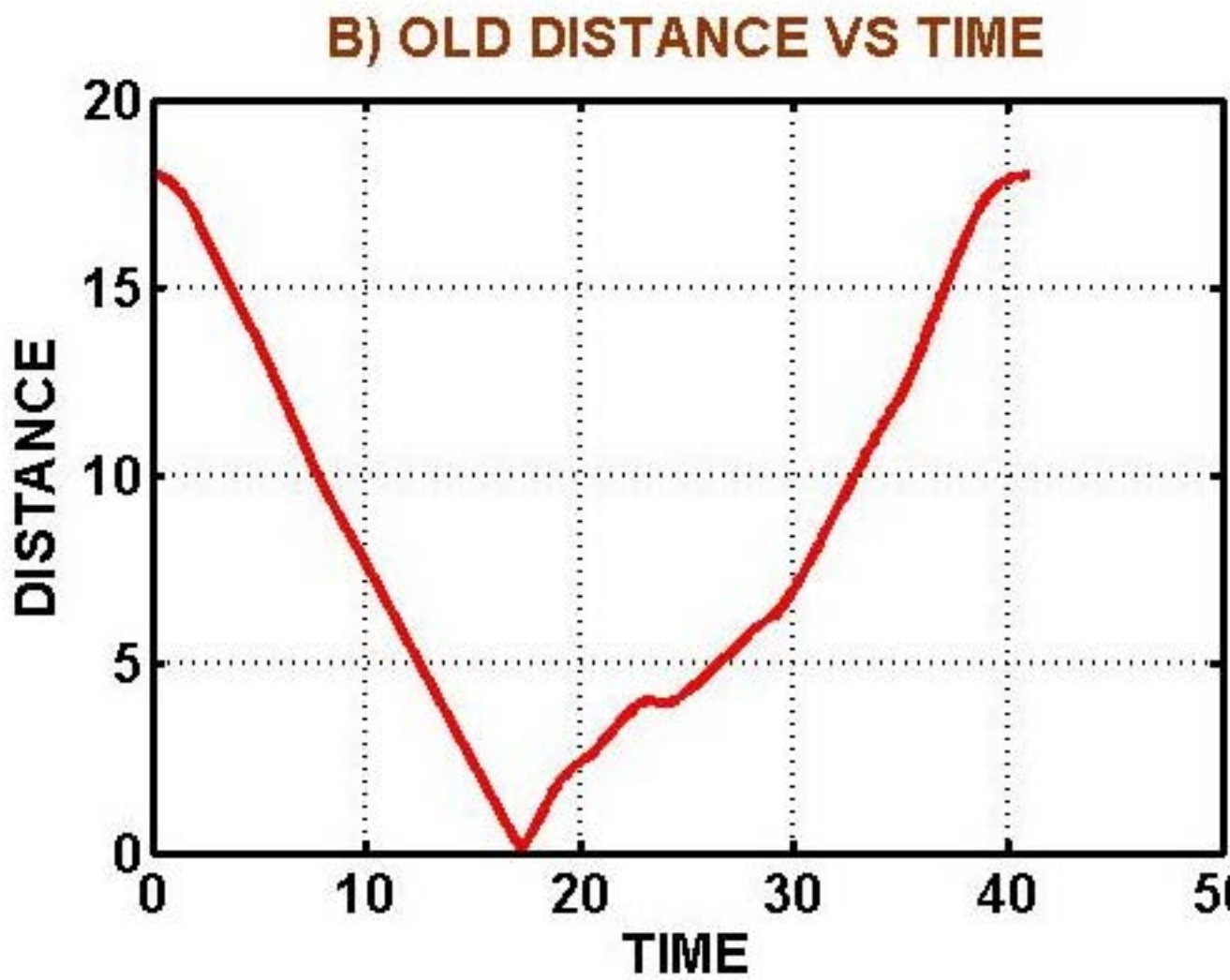
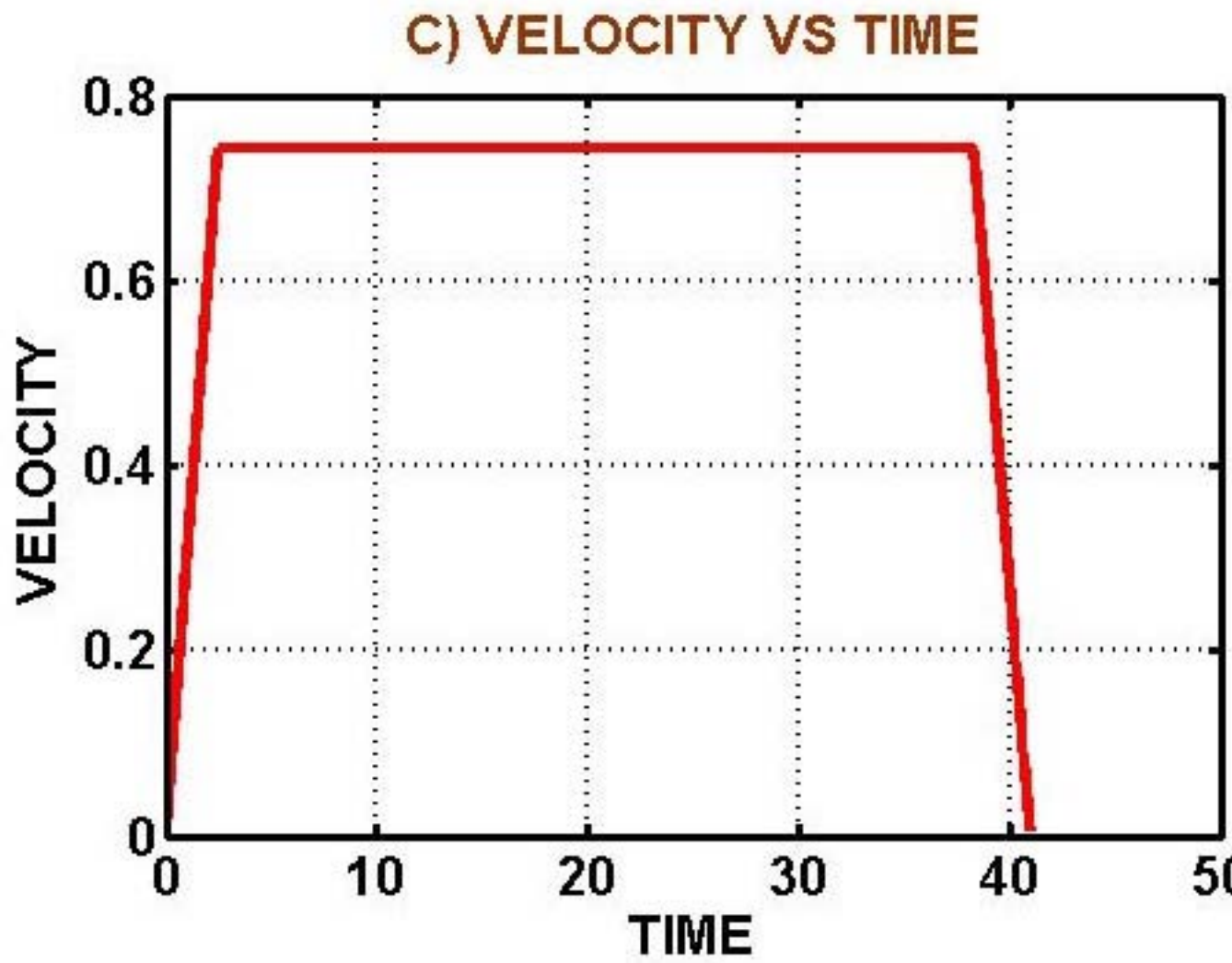
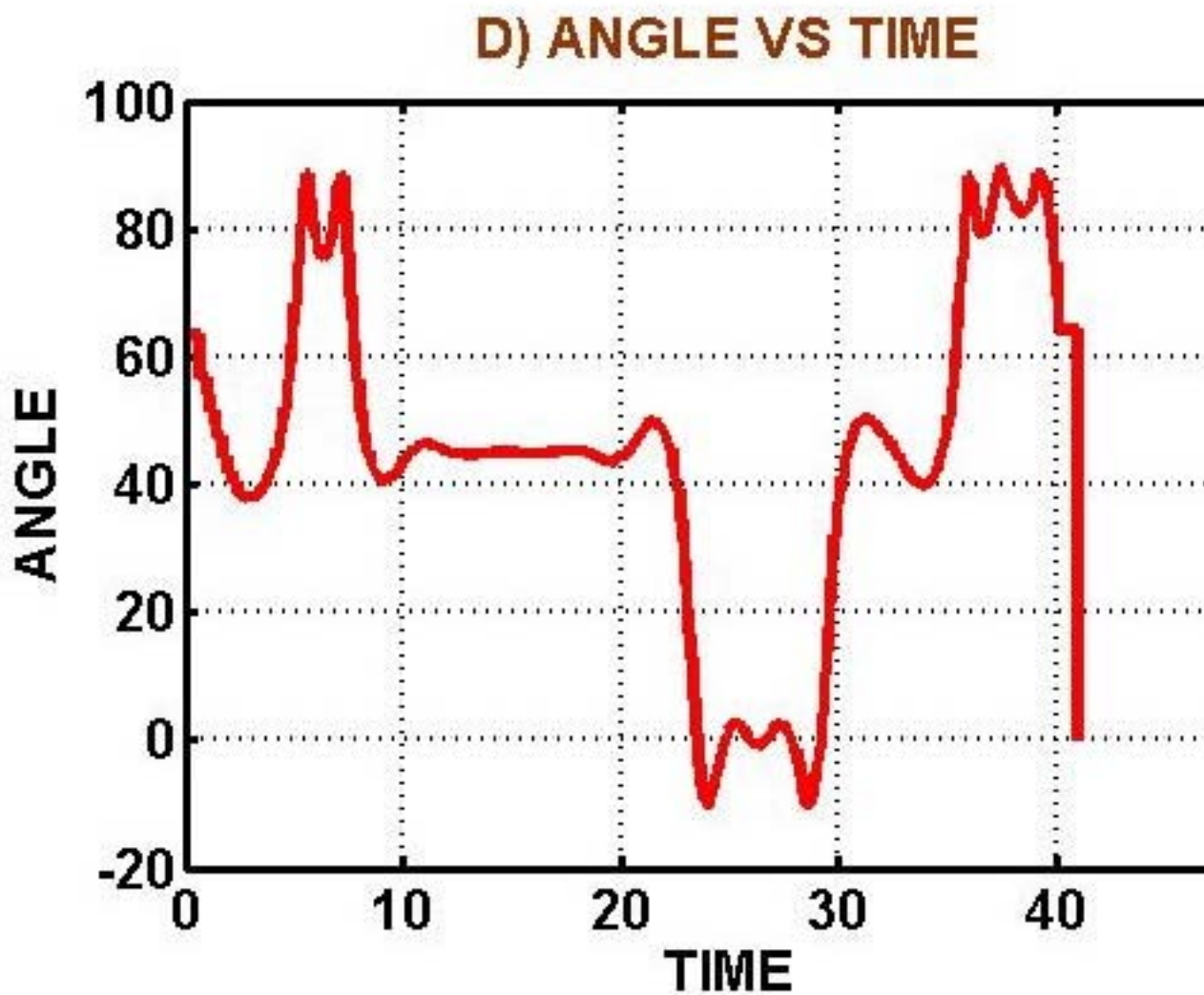


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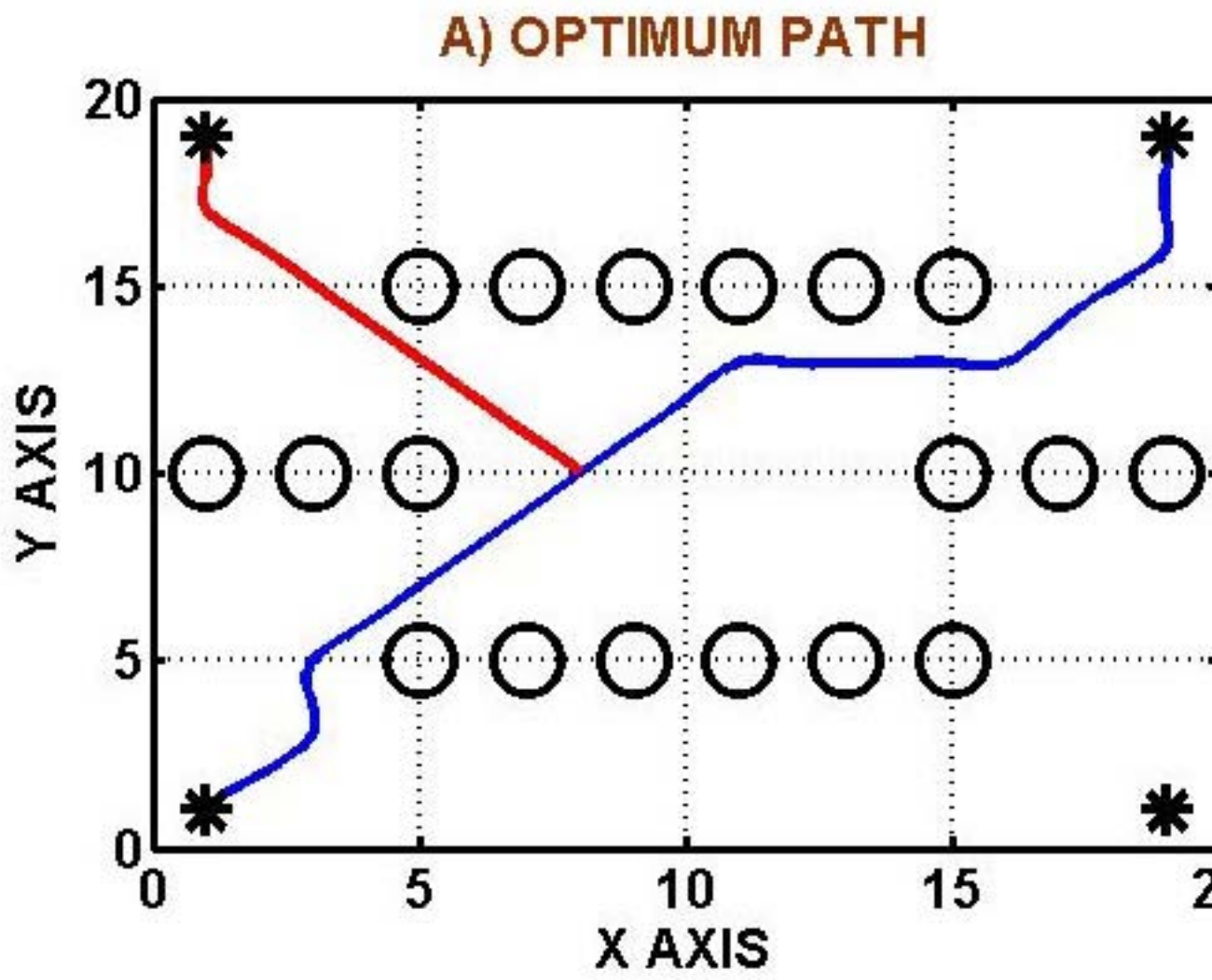
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Figure 14: Fig. 11 :



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Figure 15: Fig. 12 :Fig. 13 :



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Figure 16: Fig. 14 :

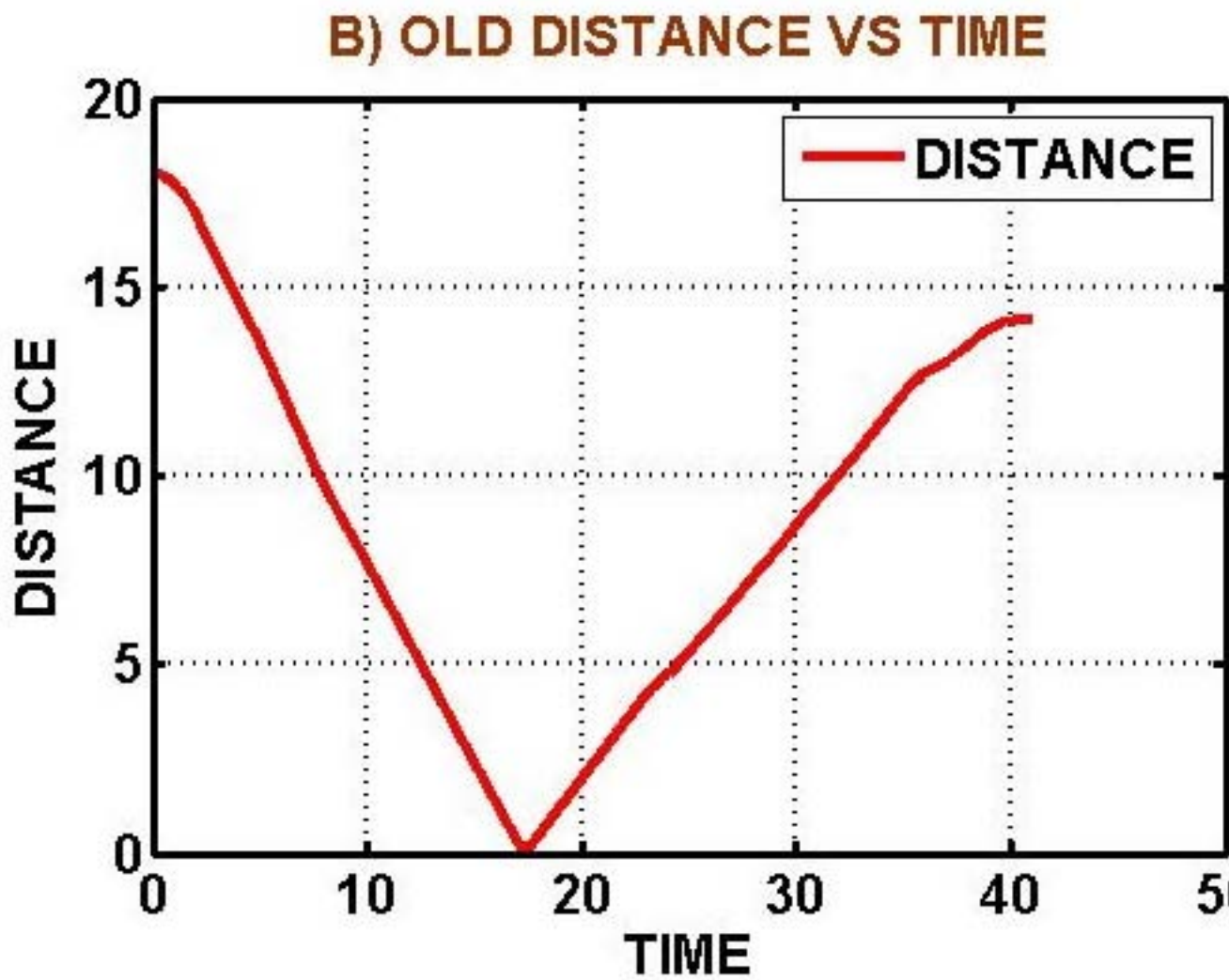
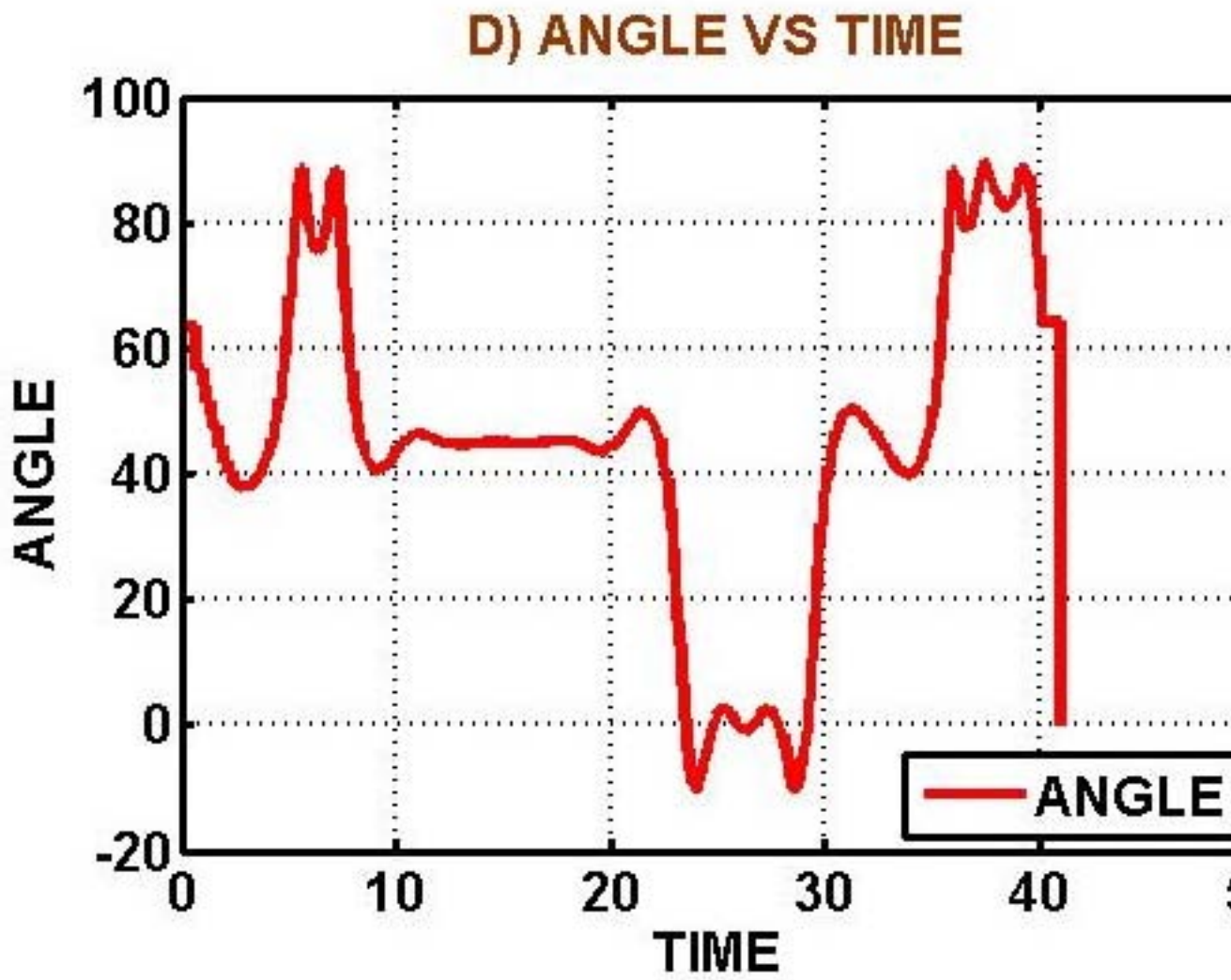


Figure 17:



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Figure 18: Fig. 15 :

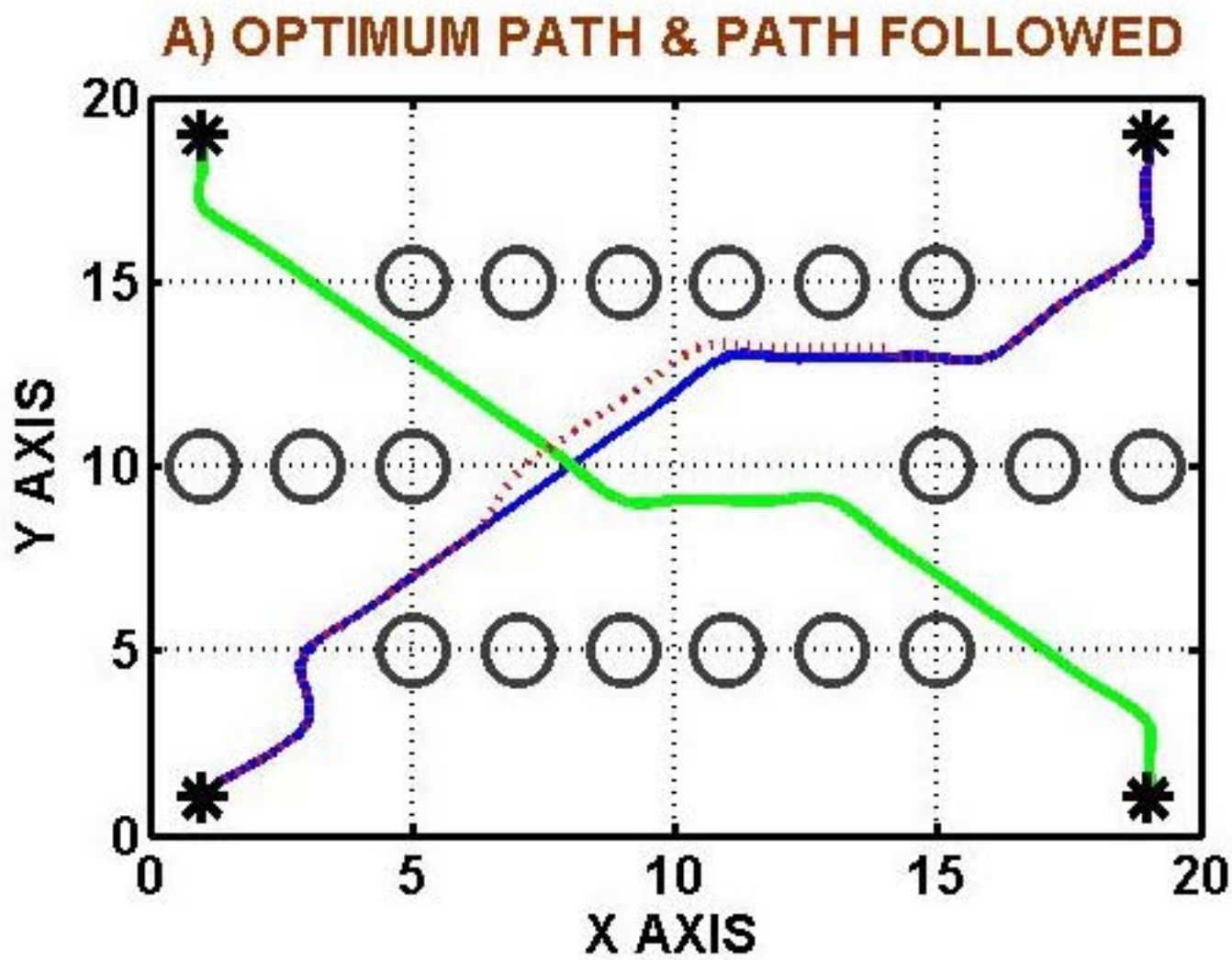


Figure 19: I

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