

# Dynamic Maze Solving using D\*-Lite and Dead-End Exclusion Algorithm



Department of Electronics and Computer Engineering  
Institute of Engineering, Thapathali Campus

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**Prepared by:**

- ☐ Anish Dahal (THA074BEX004)
- ☐ Dipak Gurung (THA074BEX009)
- ☐ Prajwol Pakka (THA074BEX022)
- ☐ Sujal Subedi (THA074BEX043)

**Supervised by:**

**Er. Dinesh Baniya Kshatri**  
**Lecturer**

# Presentation Outline

- Motivation
- Project Objectives
- Scope of Project
- Project Applications
- Requirement Analysis
- Methodology
- Result
- Discussion and Analysis
- Future Enhancements
- Conclusion
- Project schedule
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# Motivation



# Project Objectives

- To solve a dynamic maze with real-time obstacles
- To use Dead-End Exclusion algorithm for maze mapping
- To use D\*-Lite algorithm for goal seeking

# Scope of Project

- Project Capabilities
  - Navigating the maze while avoiding the dead ends
  - Finding the shortest path to the goal from start
  - Choosing the next shortest path after encountering an obstacle
- Project Limitations
  - Events of removing obstacles are not accounted
  - Robot stops moving if there is no possible path to the goal

# Project Applications

- Disaster Response
  - Provide essential supplies to people trapped during disasters
- Speleology
  - Exploring caves where humans could get lost
- Warehouse Robots
  - Ordering of goods in shelves within a warehouse
- Cleaning Robots
  - Tidies rooms using the floorplan as a map
- Delivery Robots
  - Semi-autonomous or fully-autonomous distribution of customer orders

# Requirement Analysis

- Webots Simulator (R2020B revision1)
  - Sensor Library: Distance sensor, IMU sensor
  - Joint library: Hinge joint, Ball joint
  - Actuator Library: Encoder, Rotational motor
  - C++ Language is used to design the controller

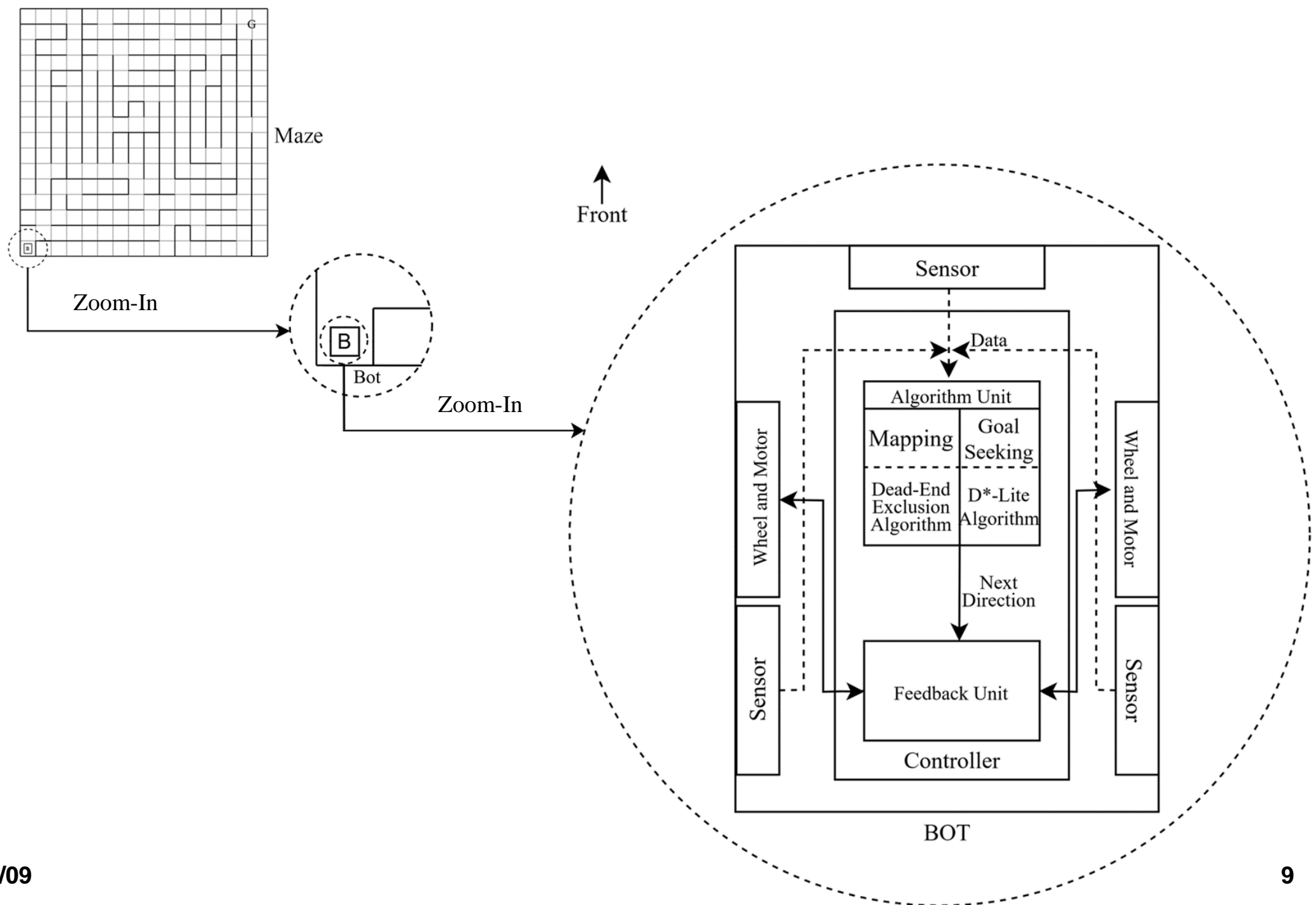
# Methodology

## (Working Mechanism of System)

- Robot perceives the environment via the sensors
- Controller maintains overall process of mapping and goal-seeking
- Robot performs movement according to output of algorithm
- Feedback controller takes response from the encoders
- Robot stops moving if:
  - Destination is reached, or
  - If there is no obstacle free path to goal

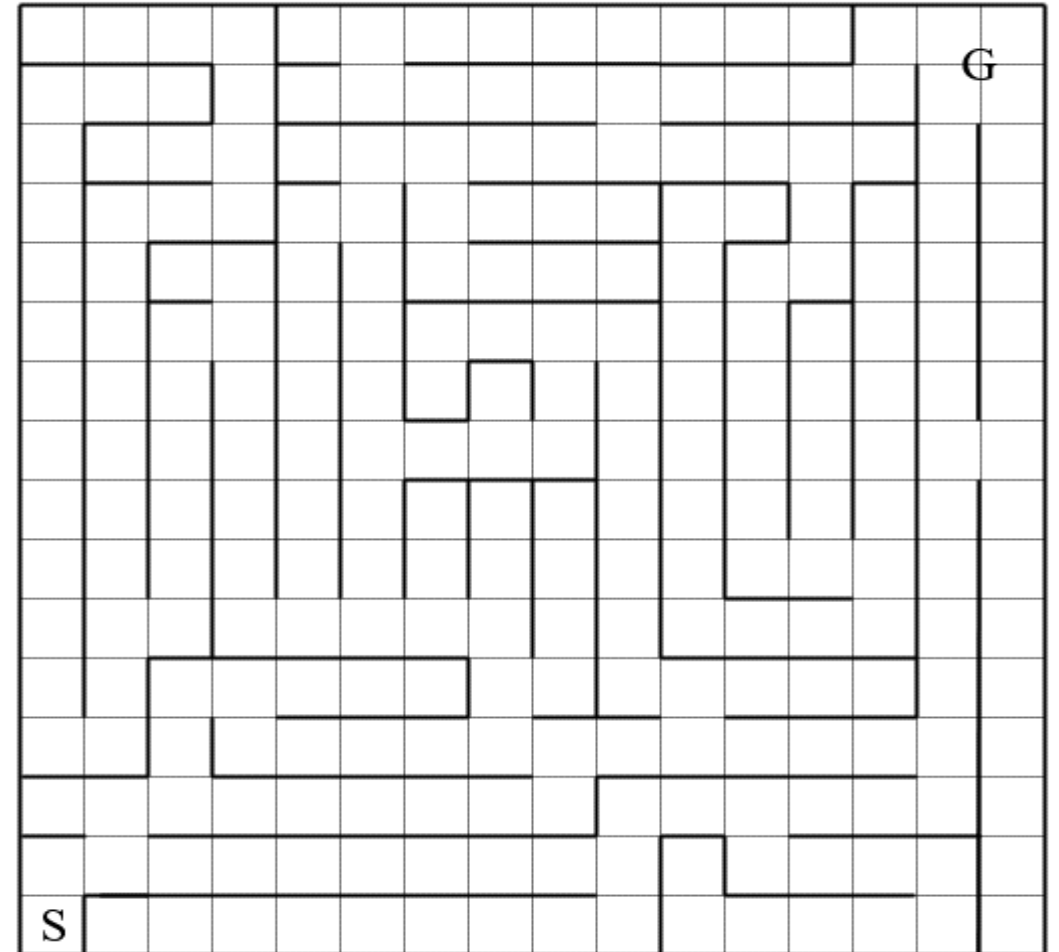


# Methodology (System Block Diagram)



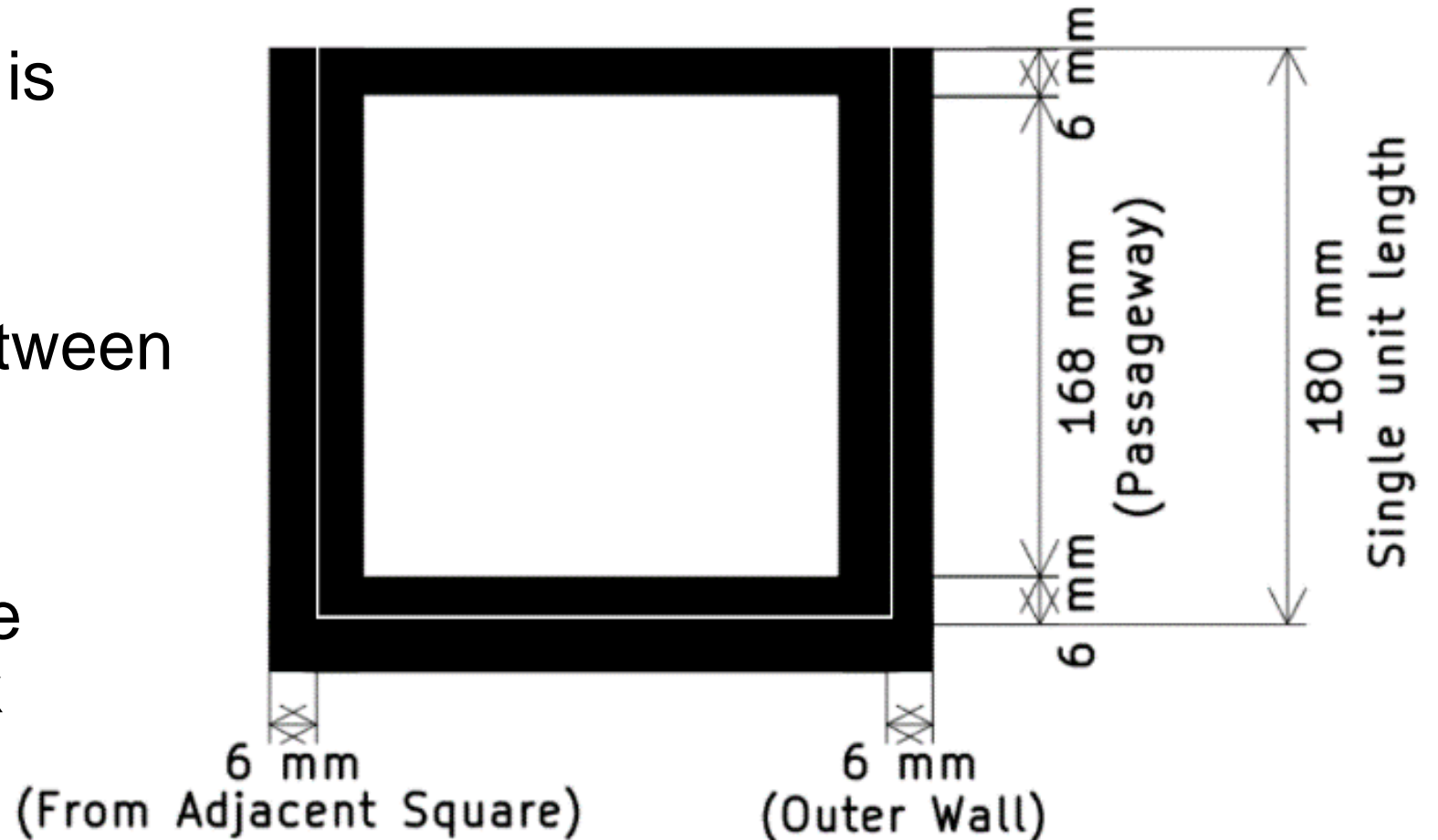
# Methodology (Maze Structure)

- Maze is formed by a  $16 \times 16$  square array
- Start of the maze is located at one of the four corners
- Starting square has walls on three sides
- Goal is a large opening which is composed of 4-unit squares



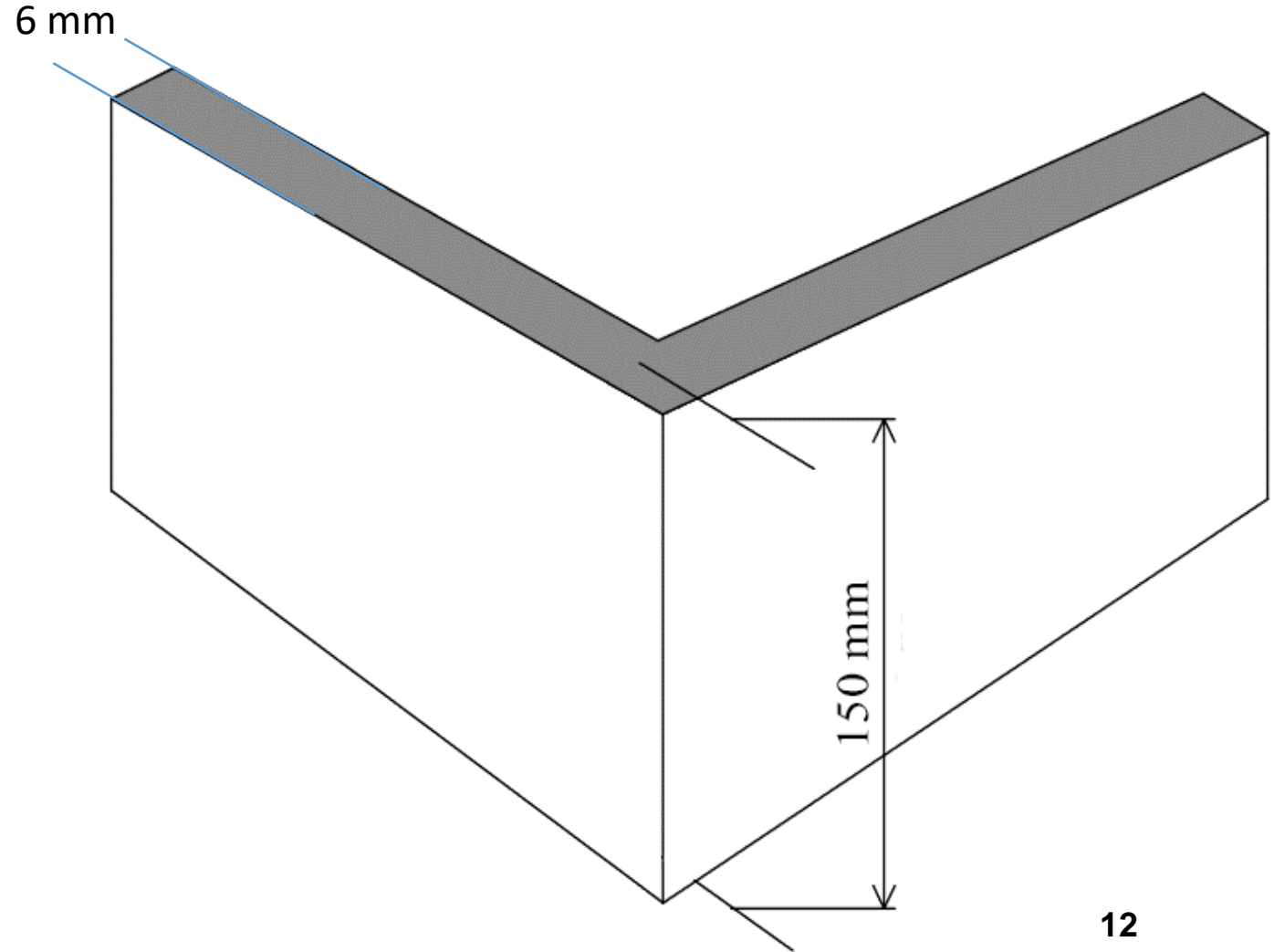
# Methodology (Unit Square of Maze)

- Each cell dimension is 180 mm × 180 mm
- The passageway between the walls is 168 mm
- The inside wall of the maze is 12 mm thick



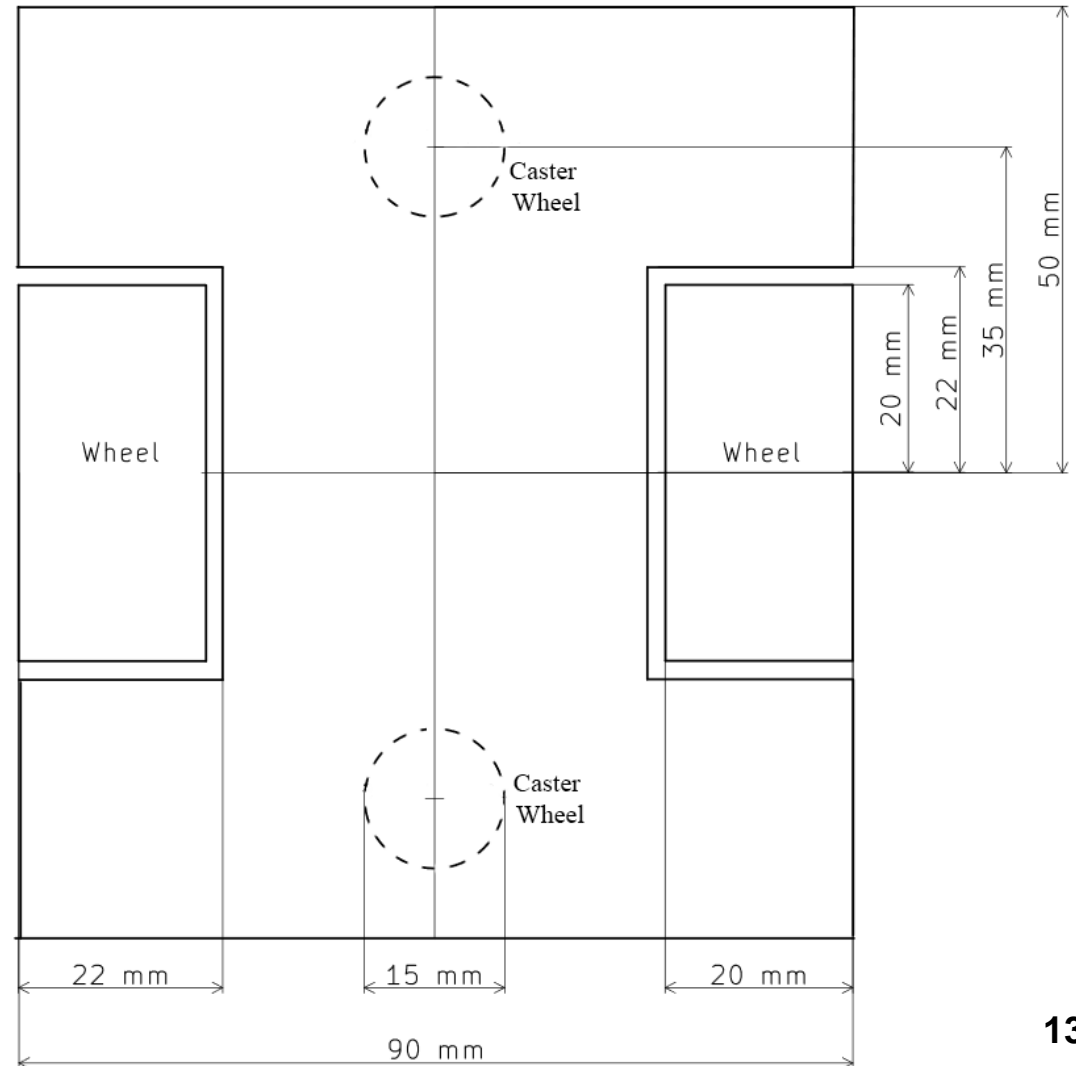
# Methodology (Wall of Maze)

- The walls surrounding the maze is 150 mm high
- The outside wall having width of 6 mm is enclose the entire maze
- The height is constant throughout the maze



# Methodology (Top View of Robot)

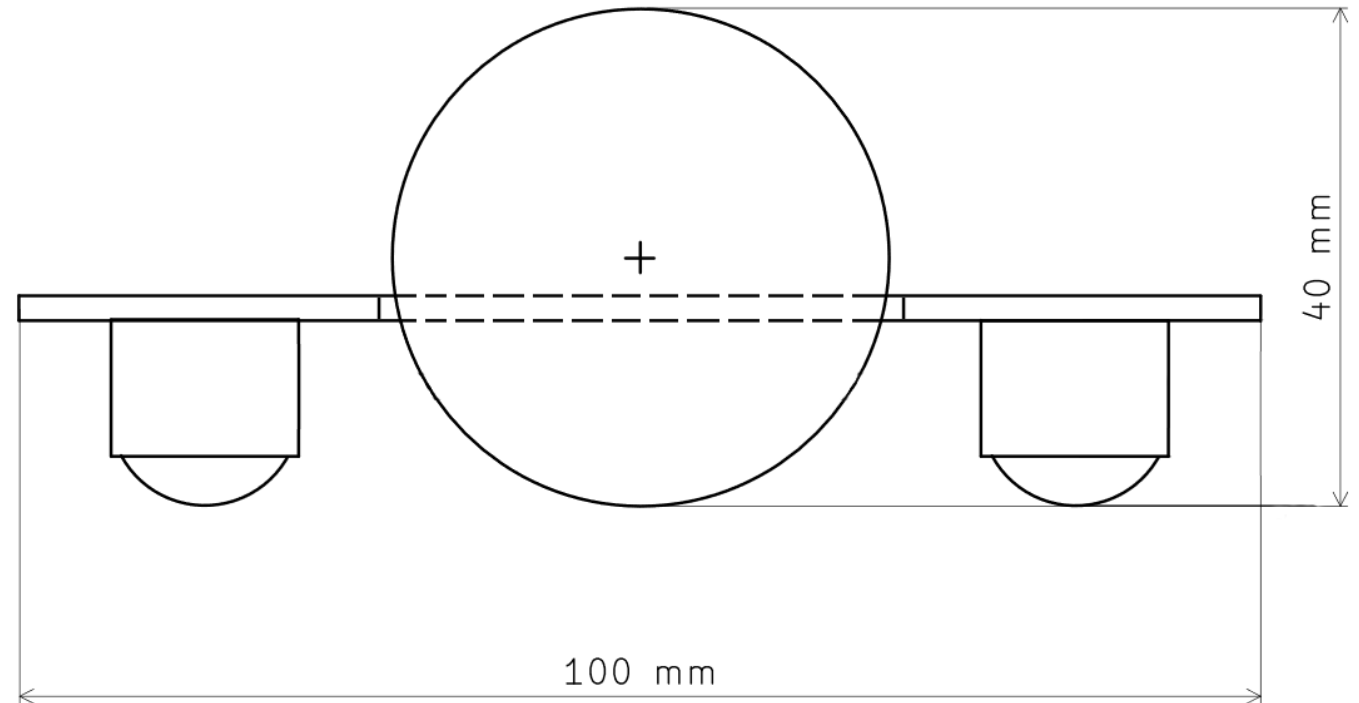
- The robot size is of 100 mm × 90 mm
- The normal wheels is of 40 mm in diameter and 20 mm wide
- The caster wheels is of diameter of 15 mm



# Methodology

## (Side View of Robot)

- The total height of bot is 40 mm
- The caster used is 15 mm in height
- The left and right views are similar



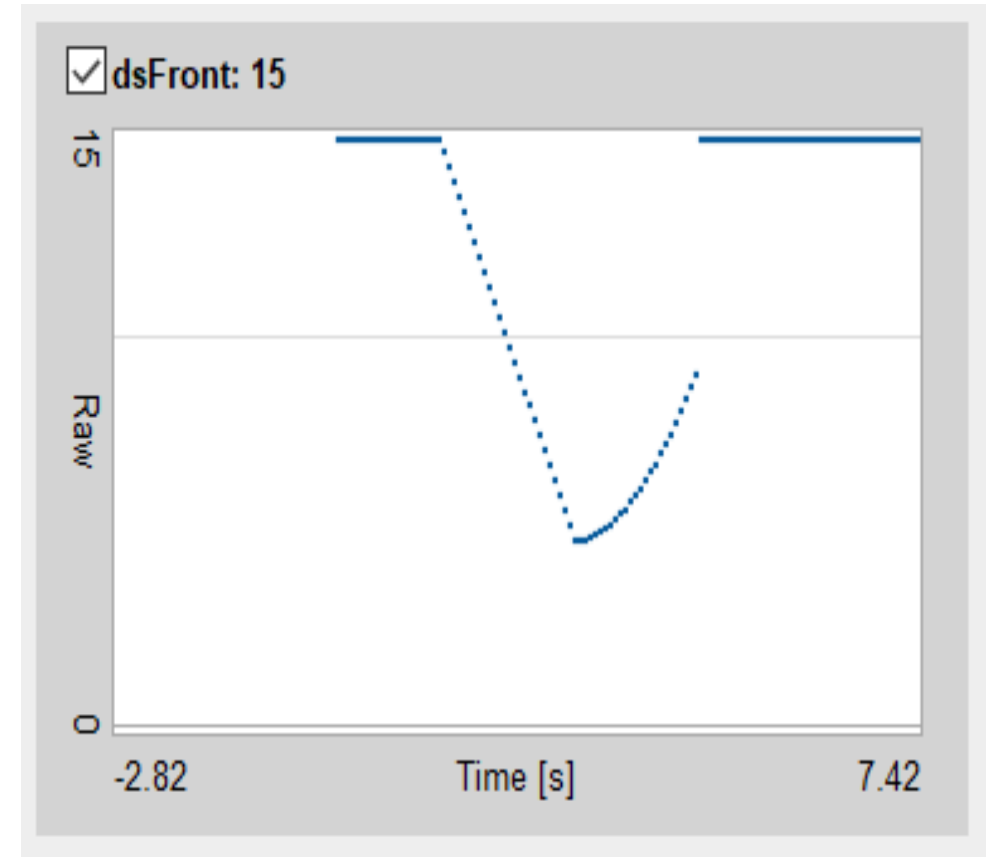
# Methodology

## (Functions of Robot's Components)

- Distance sensor is used to know the position of wall
- Controller takes sensor data and sends control signals to motor
- Motors rotates wheels and encoder provides distance travelled
- Encoder data is sent to controller to calculate position of robot
- IMU sensor provides the orientation of the robot in a cell

# Methodology (Distance Sensors)

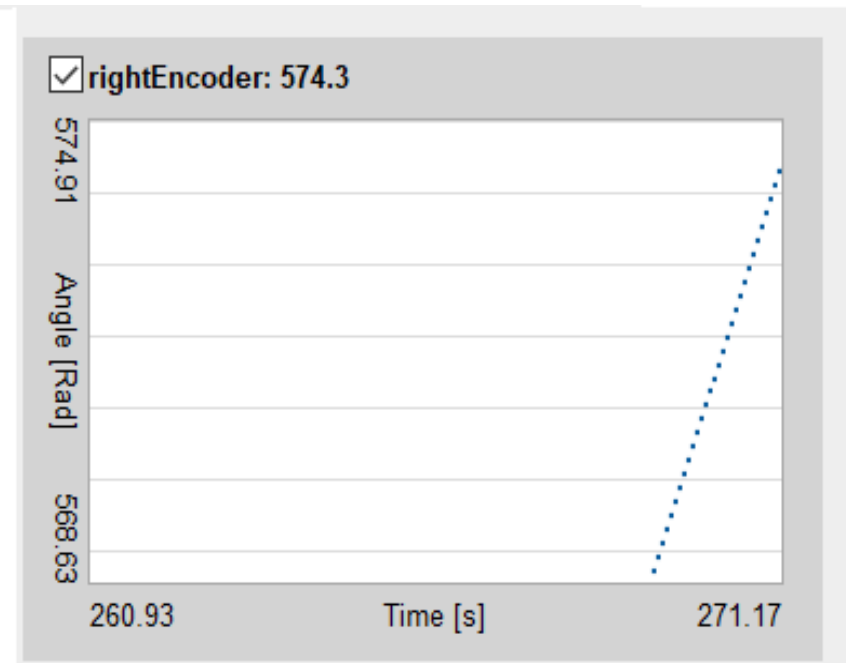
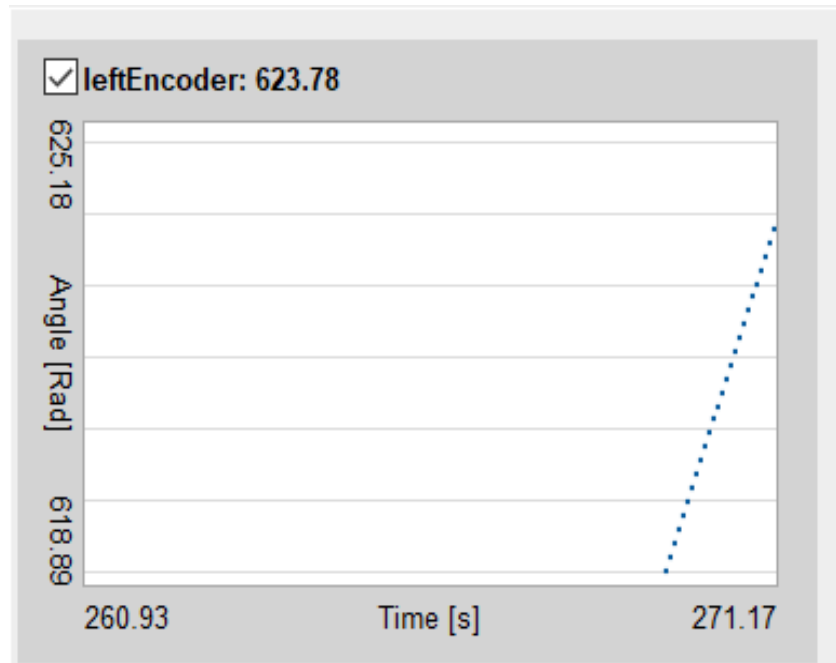
- Distance sensor provides an analog output of 0-15
- The outputs provided by the sensor corresponds to the distance in cm
- Value 15 is outputted when no wall is detected
- When wall or any obstacle is detected, the value is less than 15





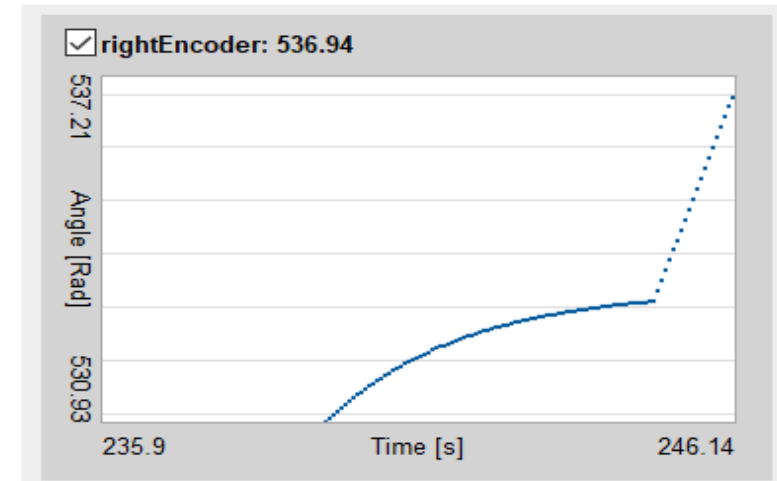
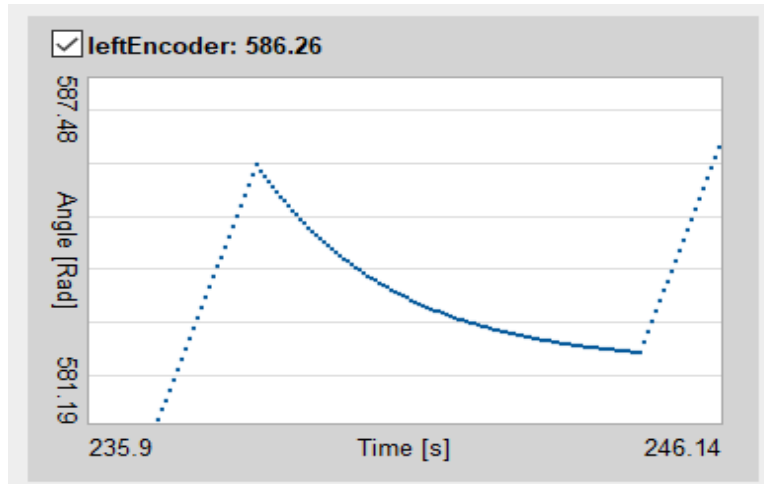
# Methodology (Encoders) – [1]

- They provide angular rotation in radians
- Linear distance is calculated by multiplying angular rotation with the radius of the wheel

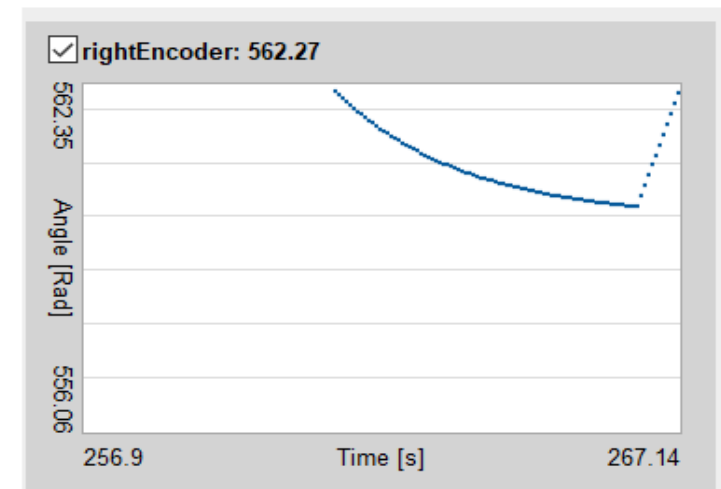
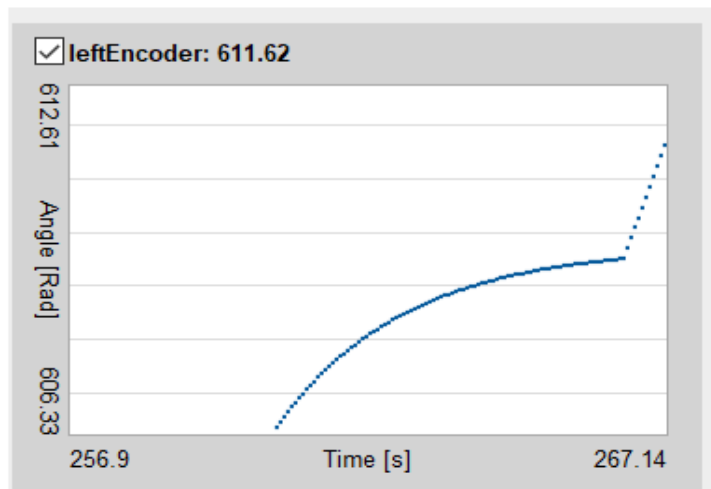


# Methodology (Encoders) – [2]

- For anti-clockwise turn, right encoder data will increase and left will decrease

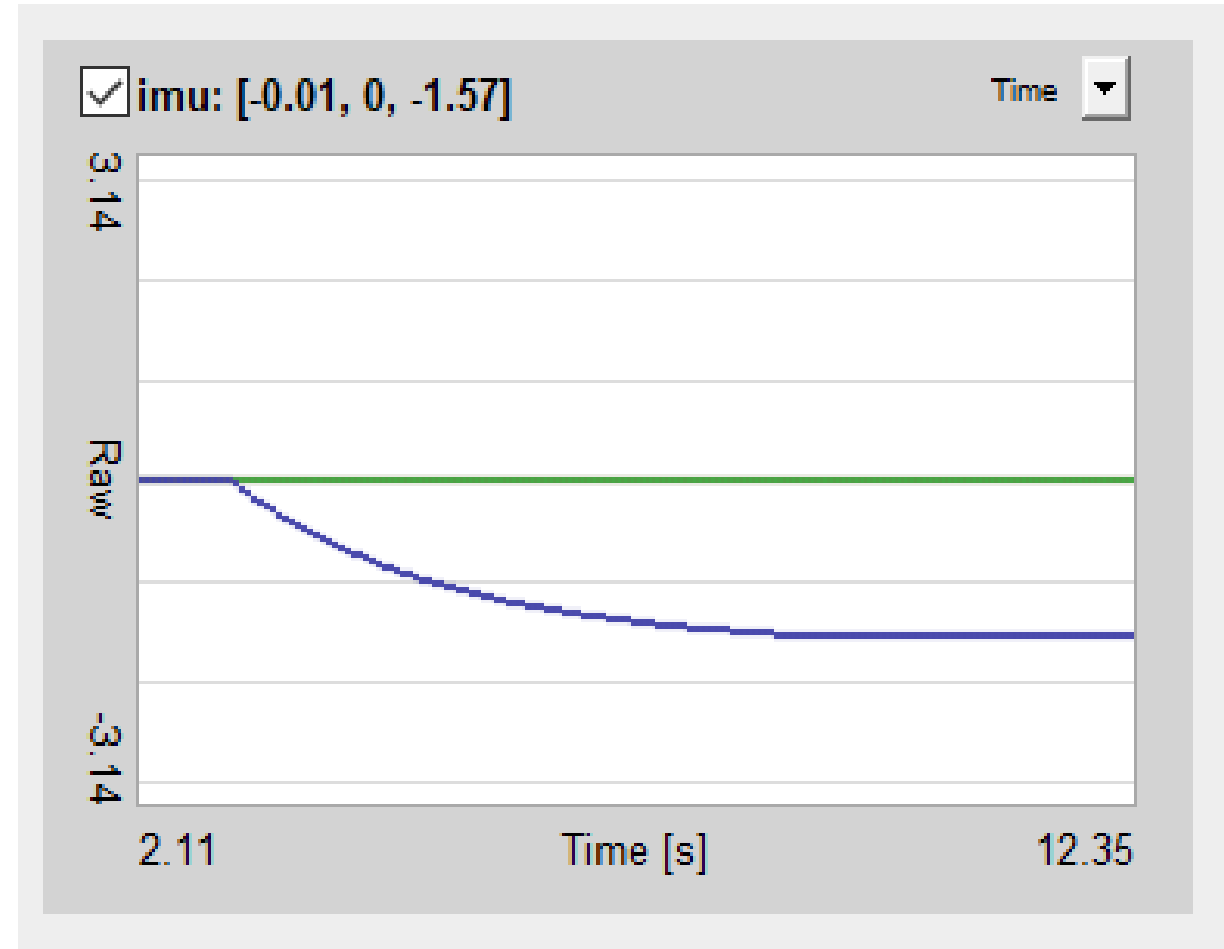


- For clockwise turn, left encoder data will increase and right will decrease



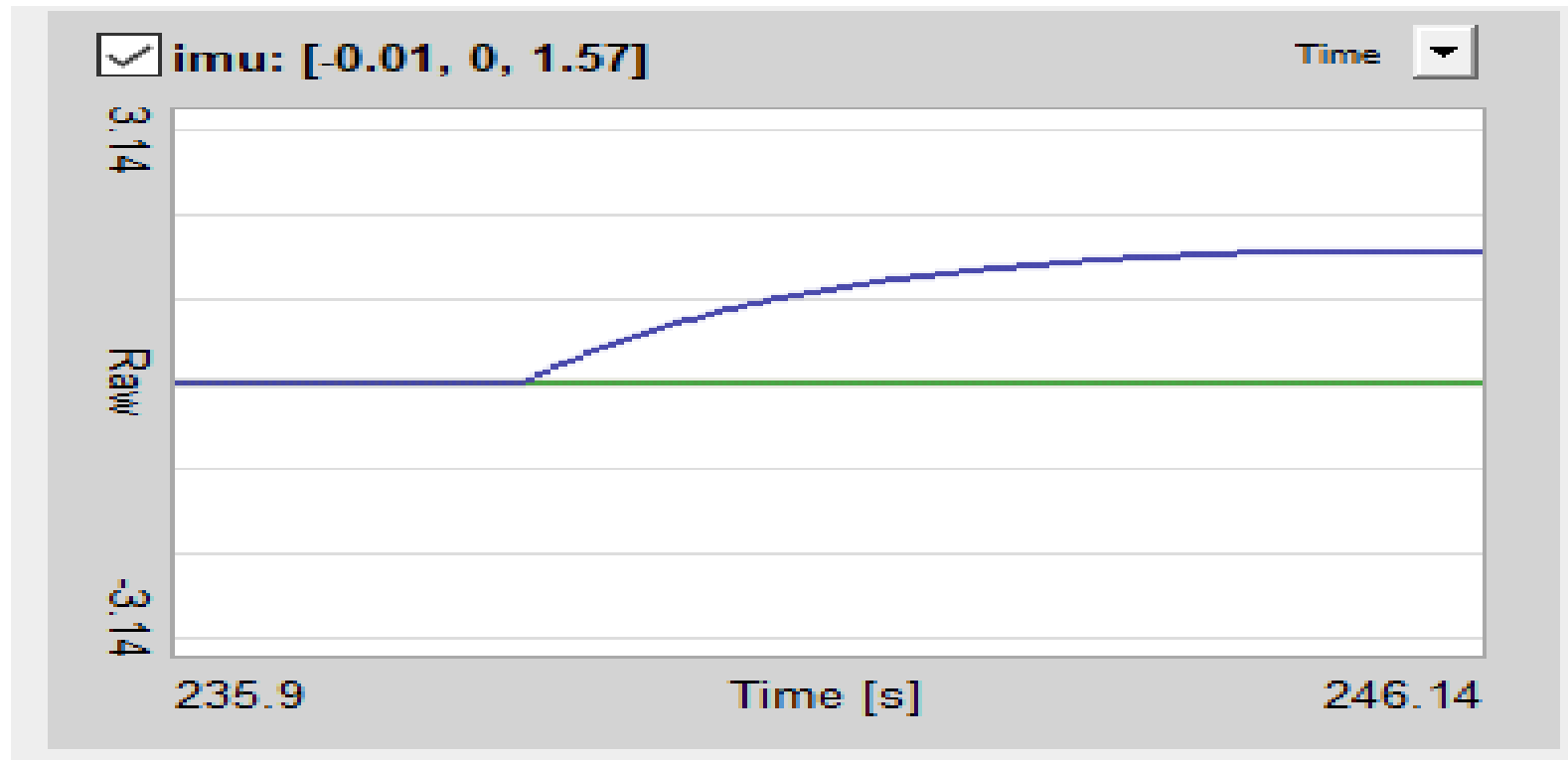
# Methodology (IMU Sensor) – [1]

- Used to calculate the orientation of the robot
- Provides the roll, pitch and yaw of the robot
- Only yaw is considered, which is the rotation around Y-axis
- Yaw data changes by -1.57 radian during clockwise turn



# Methodology (IMU Sensor) – [2]

- Yaw data changes by +1.57 radian during counter clockwise turn
- Among the three data shown in figure, the third data relates to yaw



# Methodology

## (Need for PID Tuning)

- Positional error arises while performing 90° or 180° rotation of the robot
- Error is calculated from the left and right distance sensors
  - $Error = Left\ Distance\ Sensor\ value - Right\ Distance\ sensor\ Value$
- If the error is not corrected, the robot moves off track and collides with a side wall
- To mitigate the above positional error PID tuning is applied

# Methodology

## (Maze Solving Process)

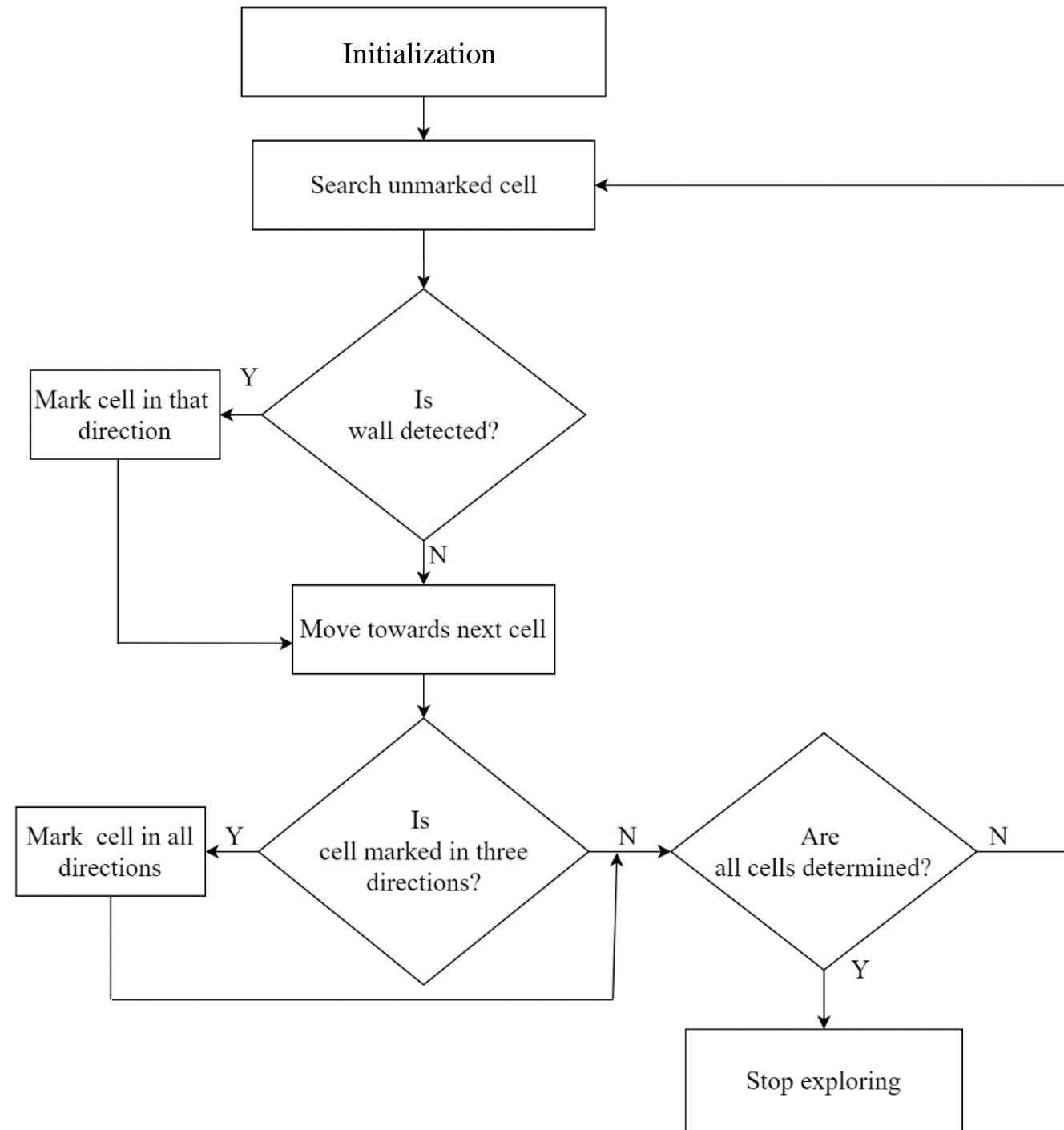
- The maze solving takes place in two steps
  - Maze Exploration
  - Goal Seeking
- Maze Exploration refers to virtual mapping of the maze
- Maze Exploration is carried out through Dead-End algorithm
- Goal Seeking represents finding optimal path
- Goal Seeking is carried out using D\*-Lite algorithm

# Methodology

## (Description of Dead-End Exclusion Algorithm)

- Cells touching the edges of the maze are marked in the direction of the wall
- The robot searches and moves towards an unmarked cell
- If a wall is detected, the cell is marked towards the wall
- Close the cell if it is marked in three directions and treat it as a virtual wall

# Methodology (Dead-End Exclusion Flowchart)



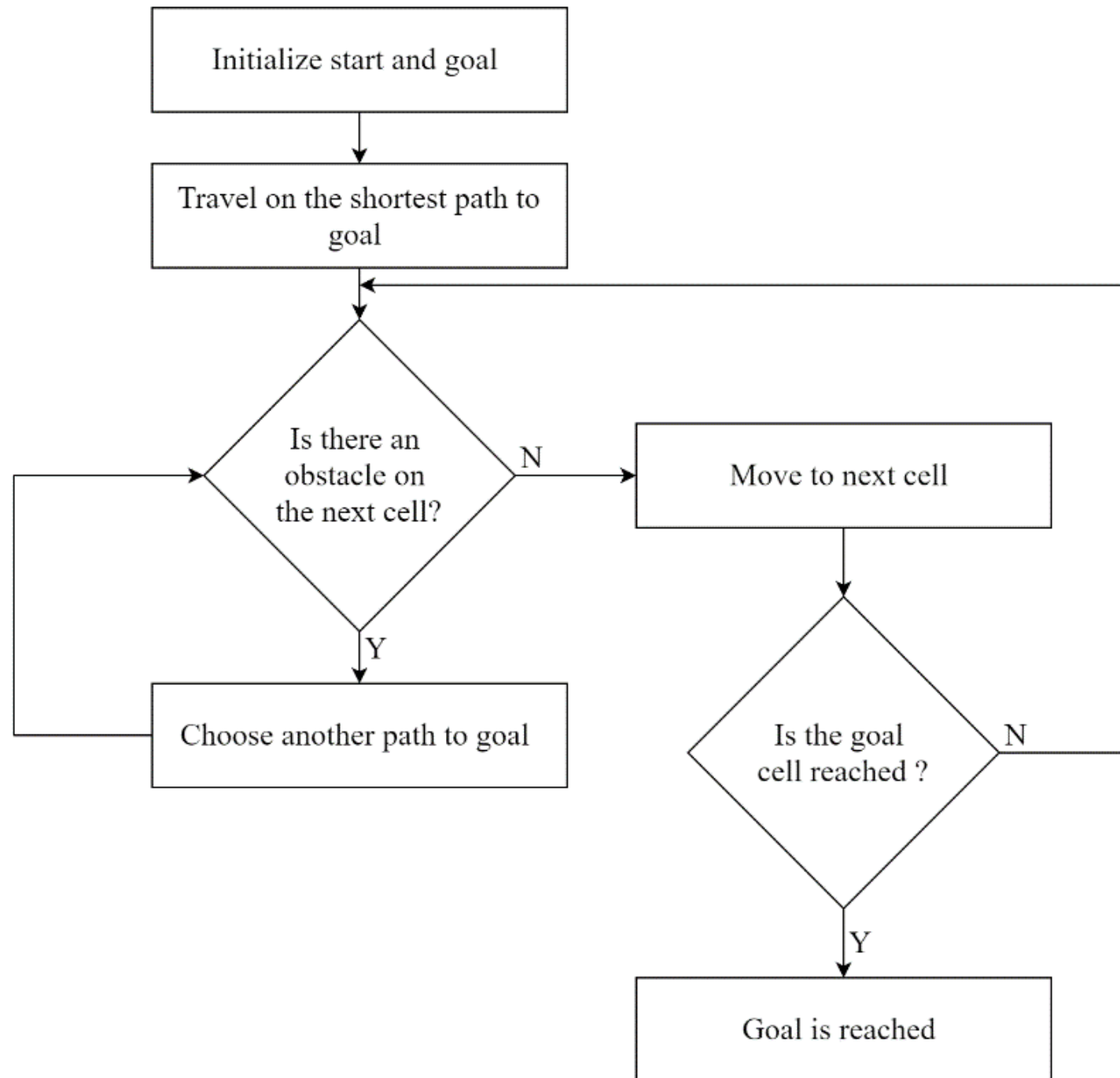


# Methodology

## (Description of D\*-Lite Algorithm)

- Initializes start and goal
- Travel on the shortest path to the goal
- Choose another path when obstacle is detected
- Move on the next selected path
- Robot stops moving when goal is reached

# Methodology (D\*-Lite Flowchart)

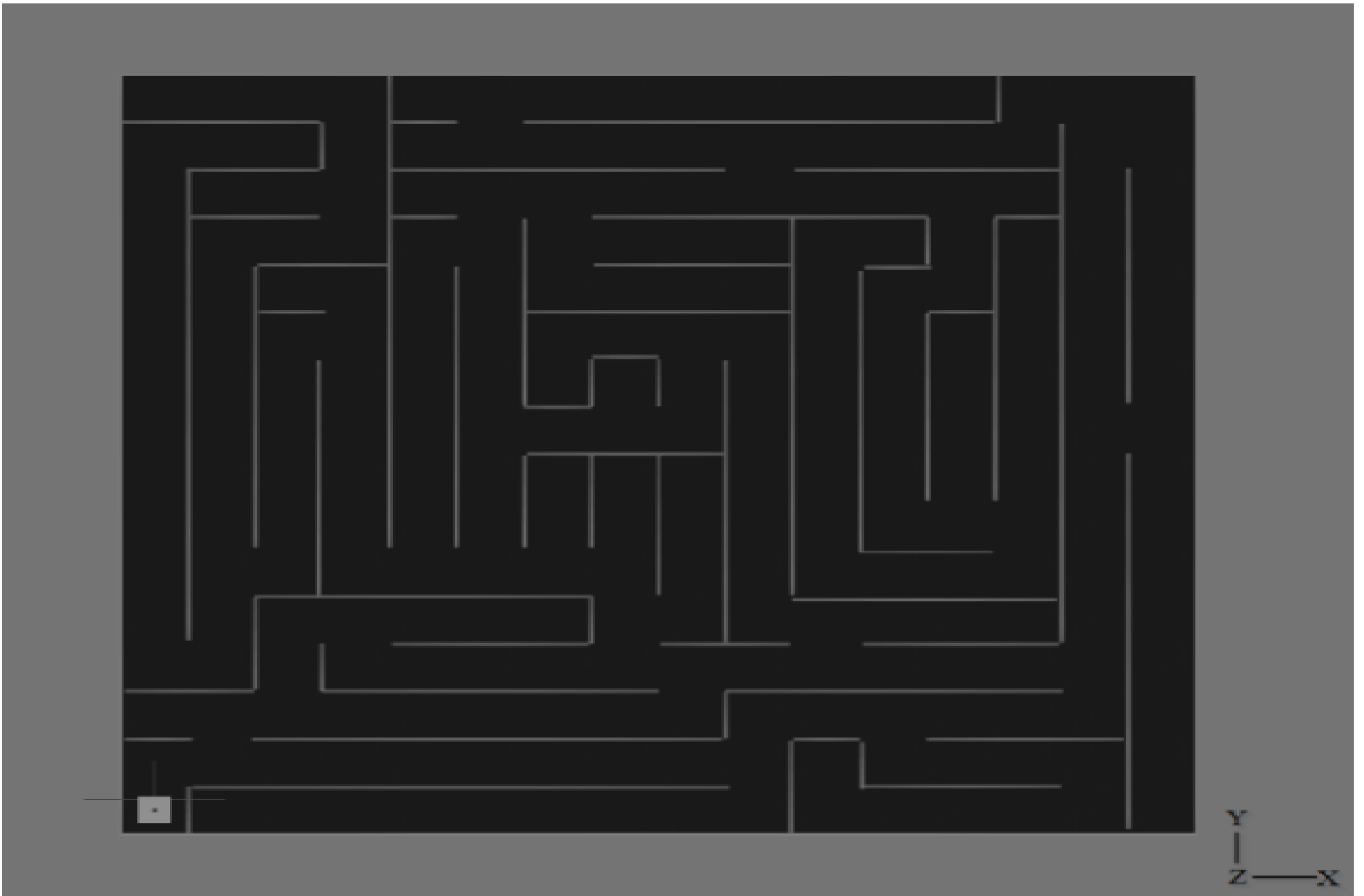


# Methodology (Data Structures)

- 1-Dimensional Array
  - Used to store the information of the cells
  - Each cell is represented by a unique number called the “Cell ID”
- Priority Queue
  - Used as open list in D\*-Lite algorithm
  - Cells of the maze are stored with the help of the key values
- Movement Queue
  - The paths to the goal are stored
  - Start cell is stored at first ,then the successor cells are stored

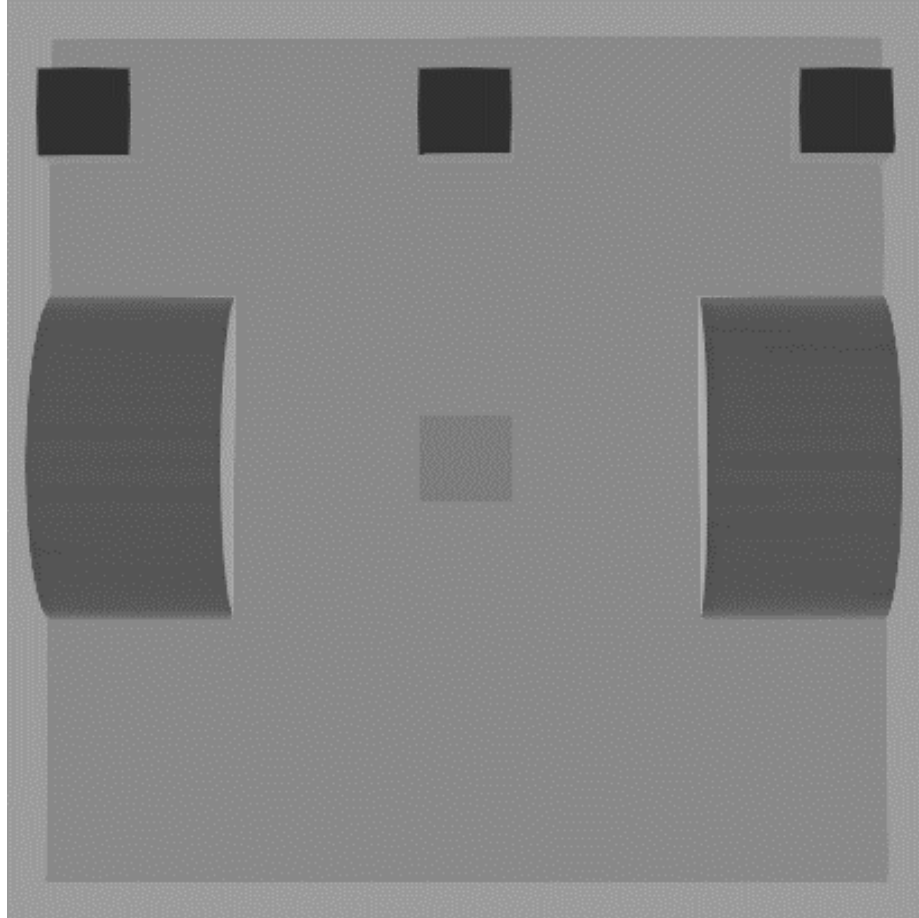
# Result

## (Top View of 3D Maze)



# Result

## (Simulated 3D View of Robot)



Top view of the robot



Side view of the robot

# Result

## (PID Tuning Procedure)

- The general equation for feedback in a PID controller is given by

$$\beta = k_p \times e + k_d \times (pE - e) + k_i \times tE$$

$k_p$ = Proportionality gain	e = Present error
$k_d$ = Derivative gain	pE = Past Error
$k_i$ = Integral gain	tE = Total Error

- $k_p = 0.05$ ,  $k_d = 0.0001$  and  $k_i = 0.00001$  are obtained from PID tuning

# Result

## (Effect from PID Parameters)

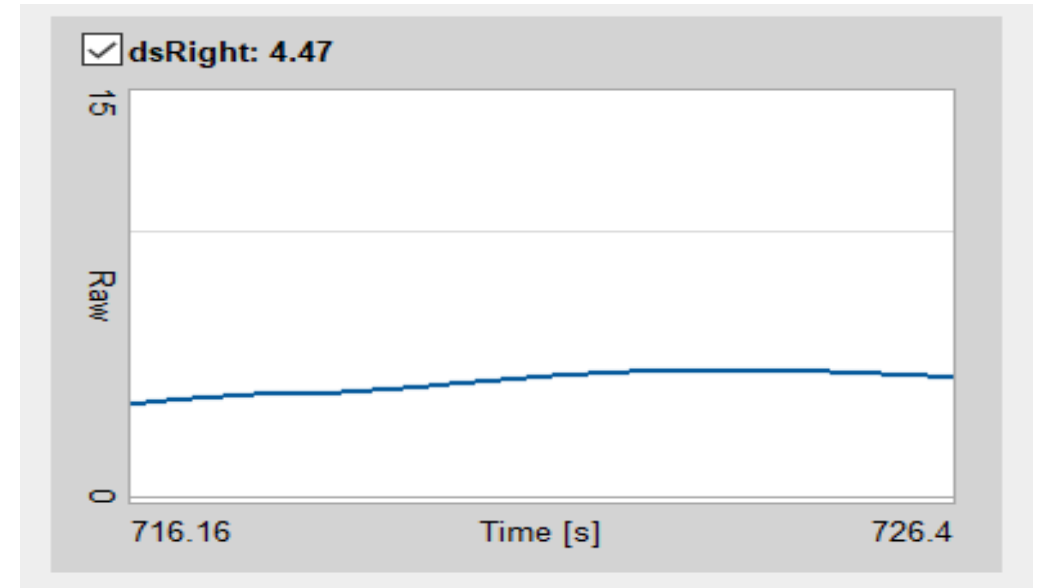
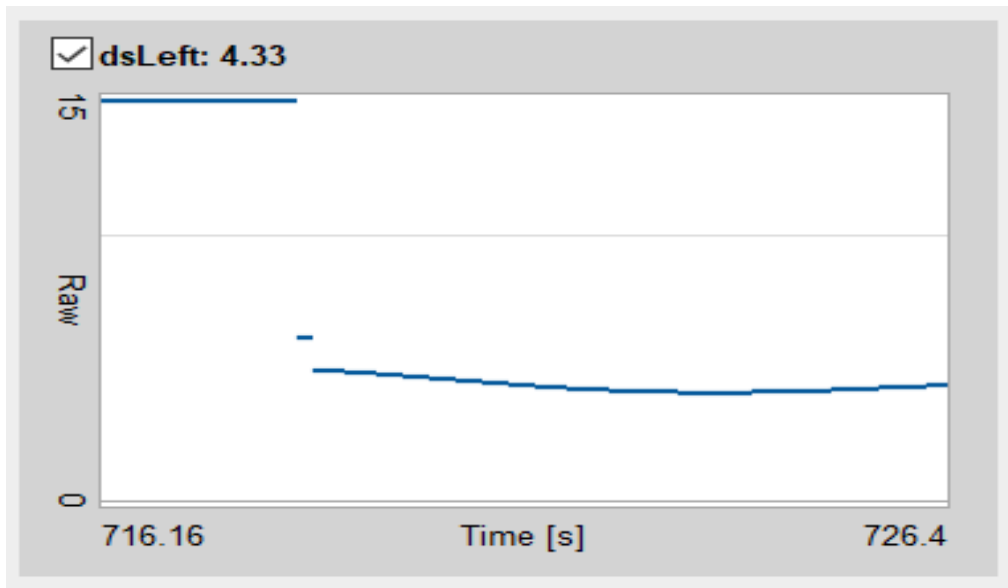
- $k_d$  and  $k_i$  cannot be ignored in the feedback even though they are small
  - slightest change in velocity causes a drastic change in orientation of the robot

Parameter	Rise Time	Overshoot	Settling Time	Stability
$K_p \uparrow$	Decrease	Increase	Small change	Degrade
$K_d \uparrow$	Decrease	Decrease	Decrease	Improve
$K_i \uparrow$	Decrease	Increase	Increase	Degrade

# Result

## (Error Mitigation by PID controller) – [1]

- Error is taken from the difference of left and right distance sensors
- Represents the proximity of the robot to a wall
- The error is maximum while moving forward after a turn

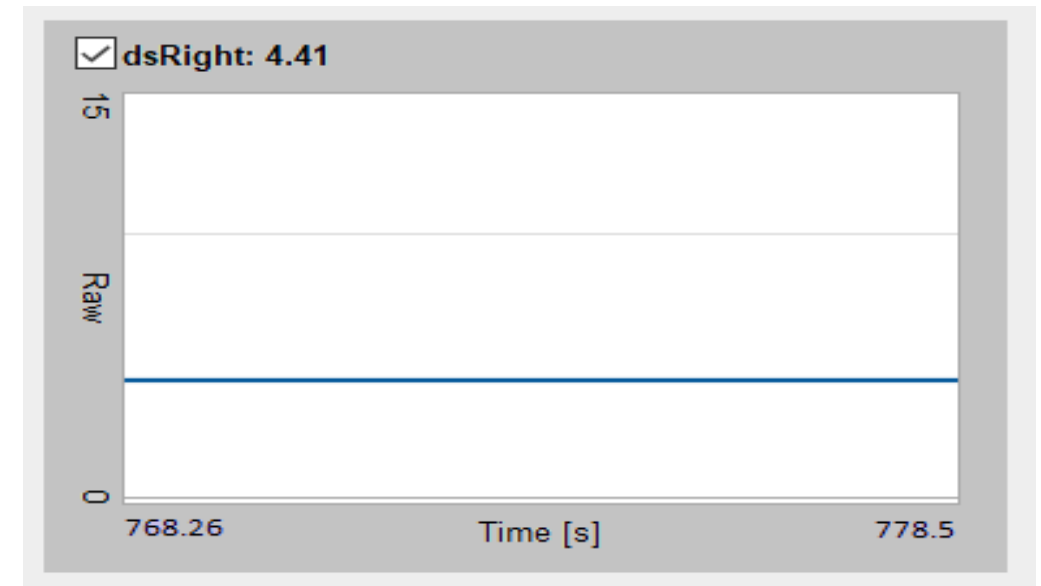
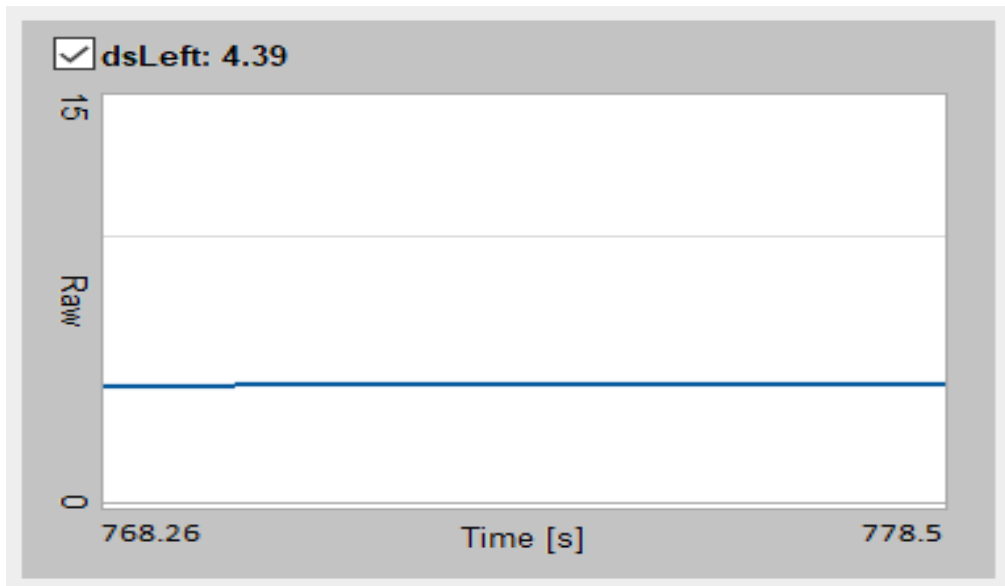




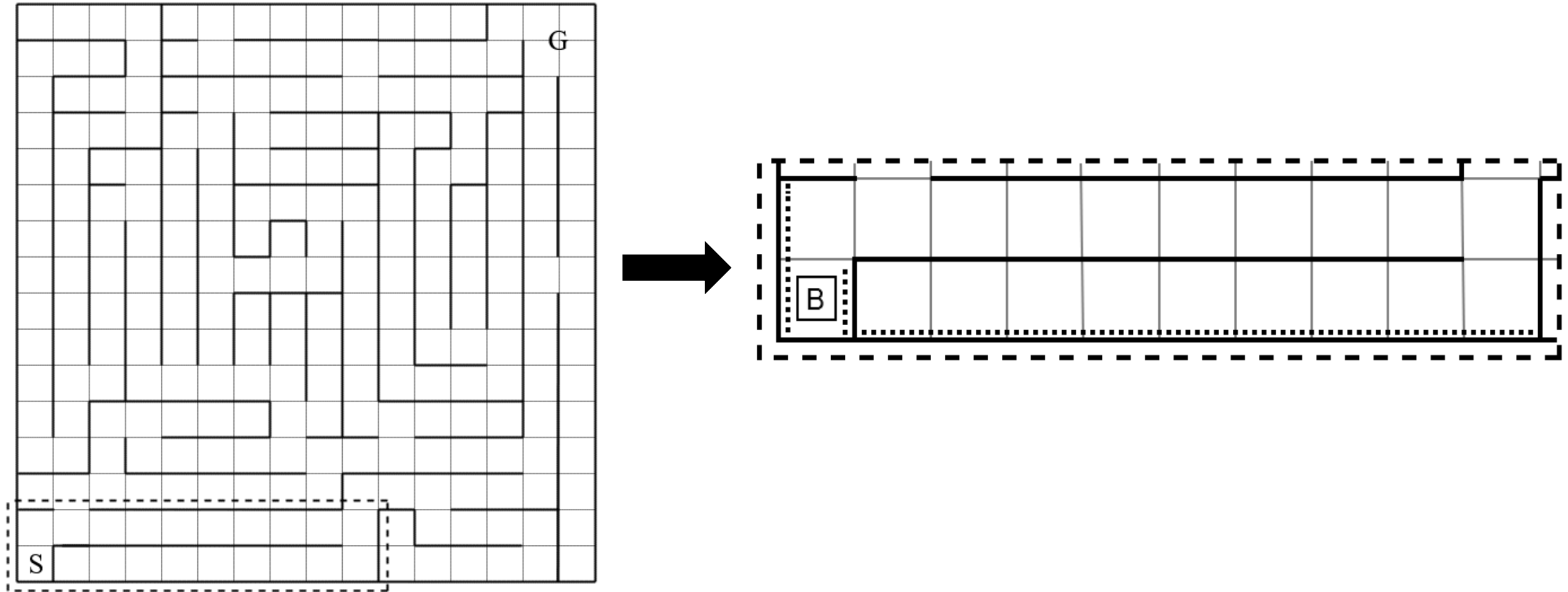
# Result

## (Error Mitigation by PID controller) – [2]

- Feedback mitigates the error and keeps the robot in center of track
- The error is small however, it is not exactly zero

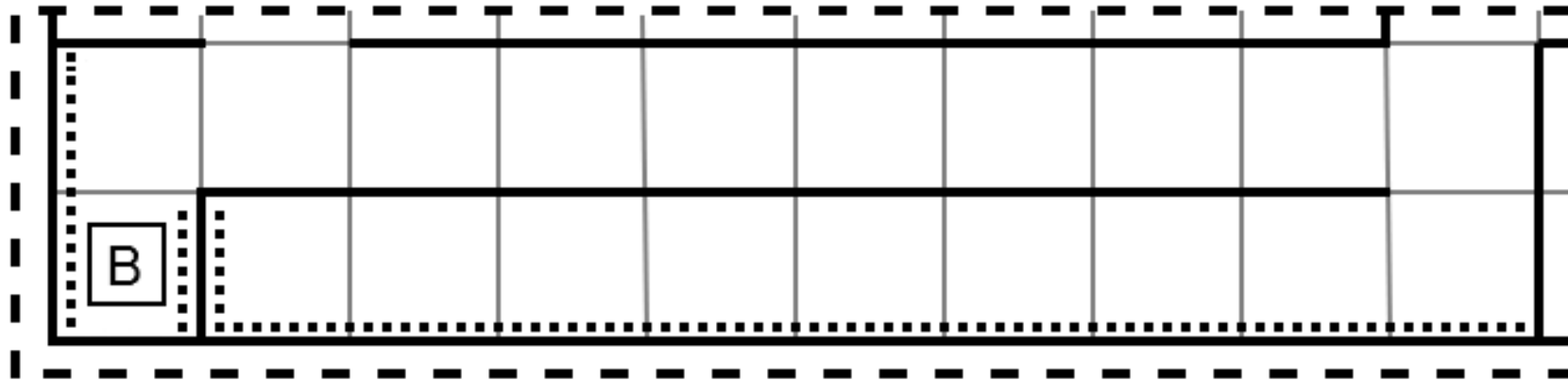


# Analysis and Discussion (Dead-End Exclusion Process) – [1]



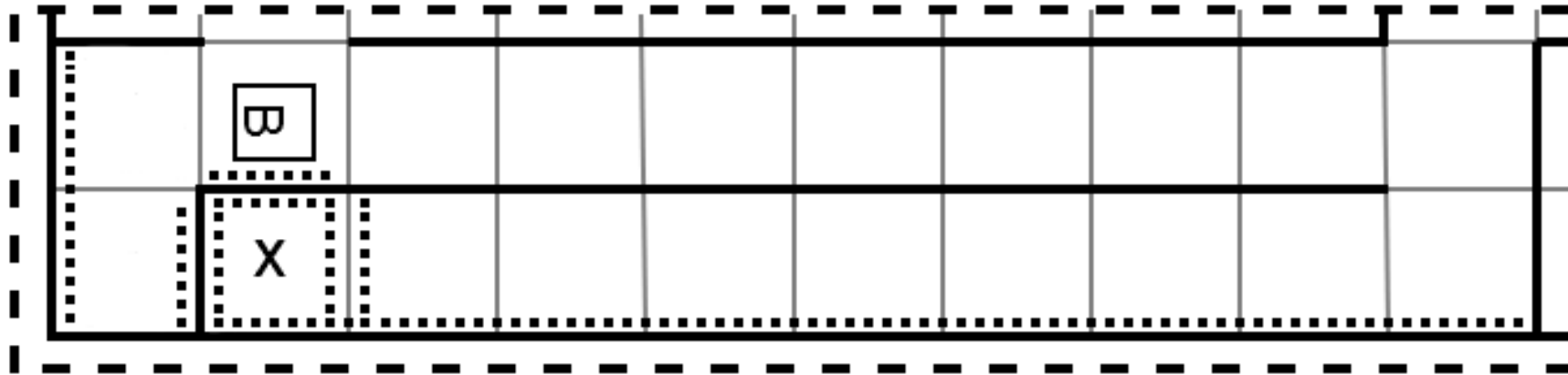
# Analysis and Discussion (Dead-End Exclusion Process) – [2]

- The figure shows the initialization process
- Robot takes the sensor value and updates its current and neighboring cells



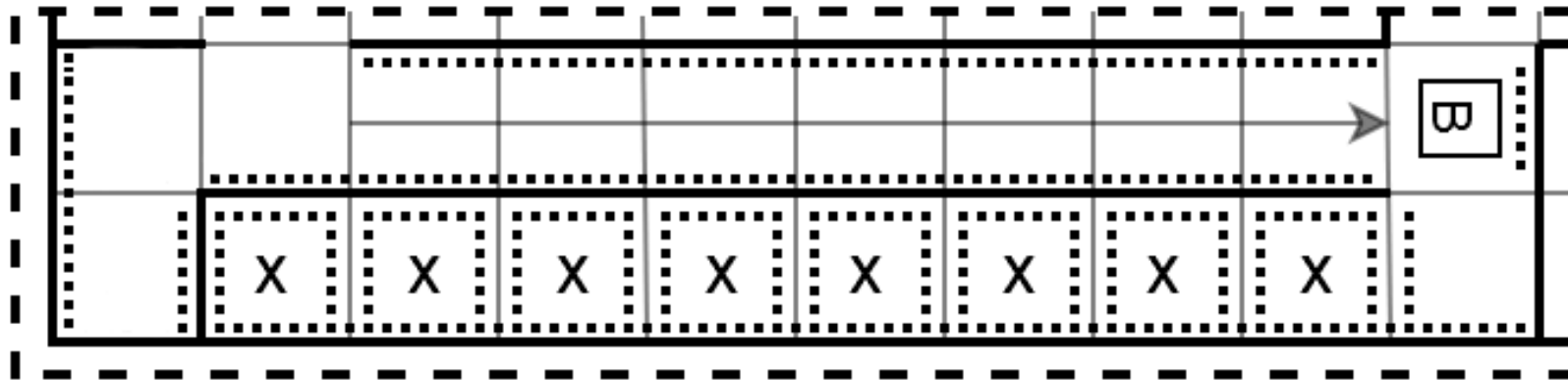
# Analysis and Discussion (Dead-End Exclusion Process) – [3]

- The robot moves forward, then updates current and neighboring cells
- The neighboring cell is marked in three directions and so it is closed



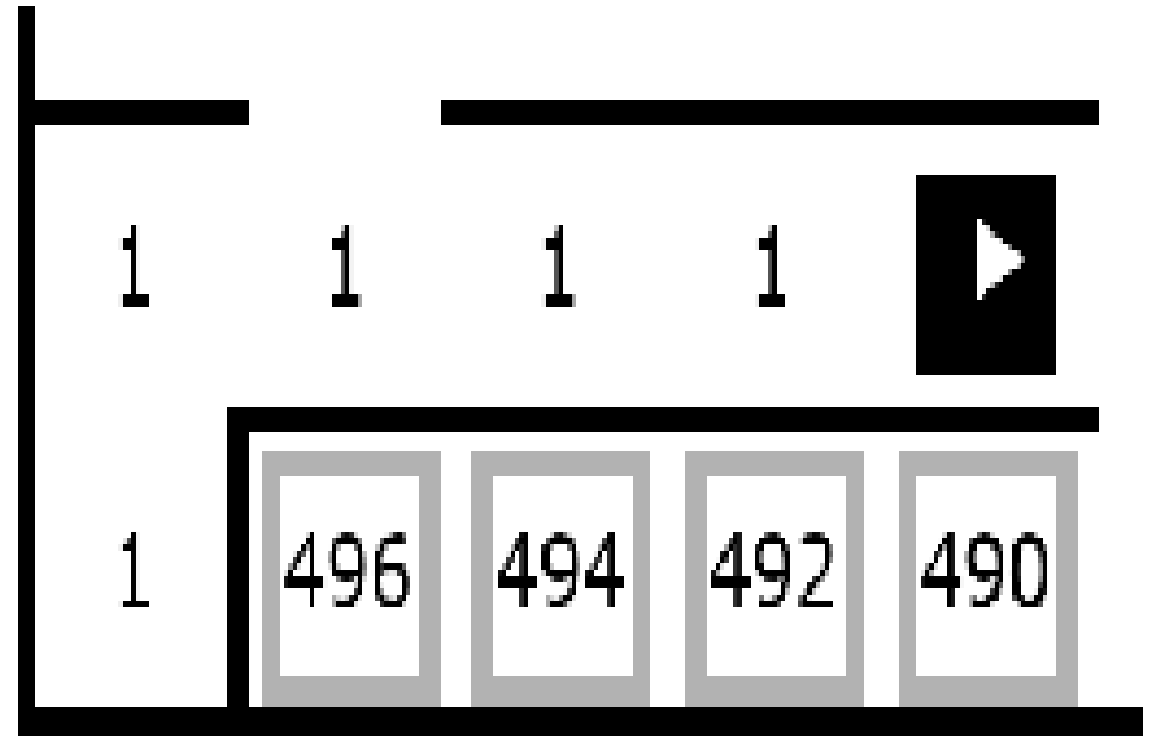
# Analysis and Discussion (Dead-End Exclusion Process) – [4]

- While the bot moves in the second row, it marks the adjacent cells in the first row
- The first row satisfies the closing conditions and so the cells are closed without visiting them



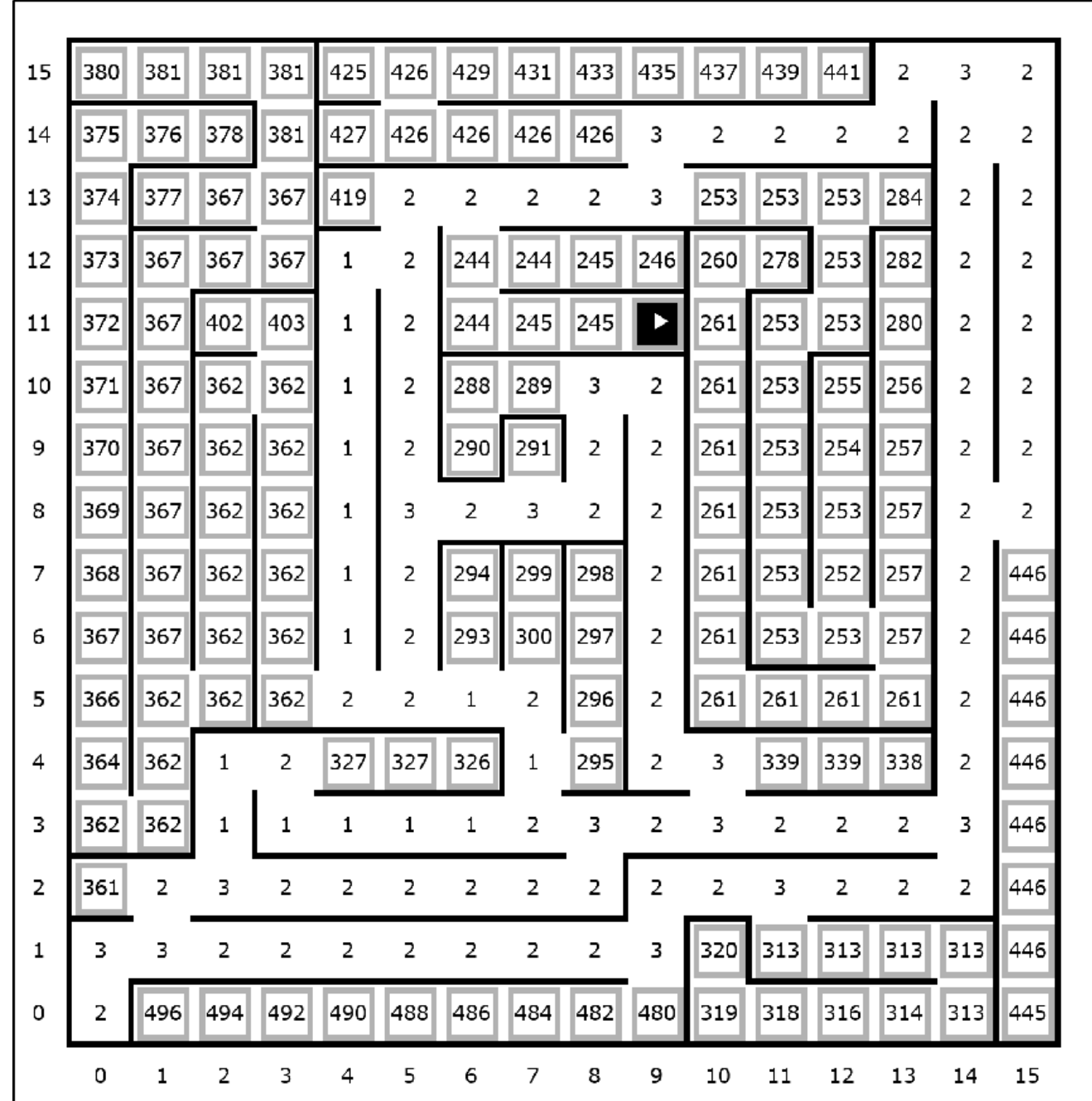
# Analysis and Discussion (Dead-End Exclusion Process) – [5]

- Number in unclosed cells represent the visit count
- Closed cells are given a varying cost
- The cost of closed cell is provided by subtracting the number of unique cells visited from 500



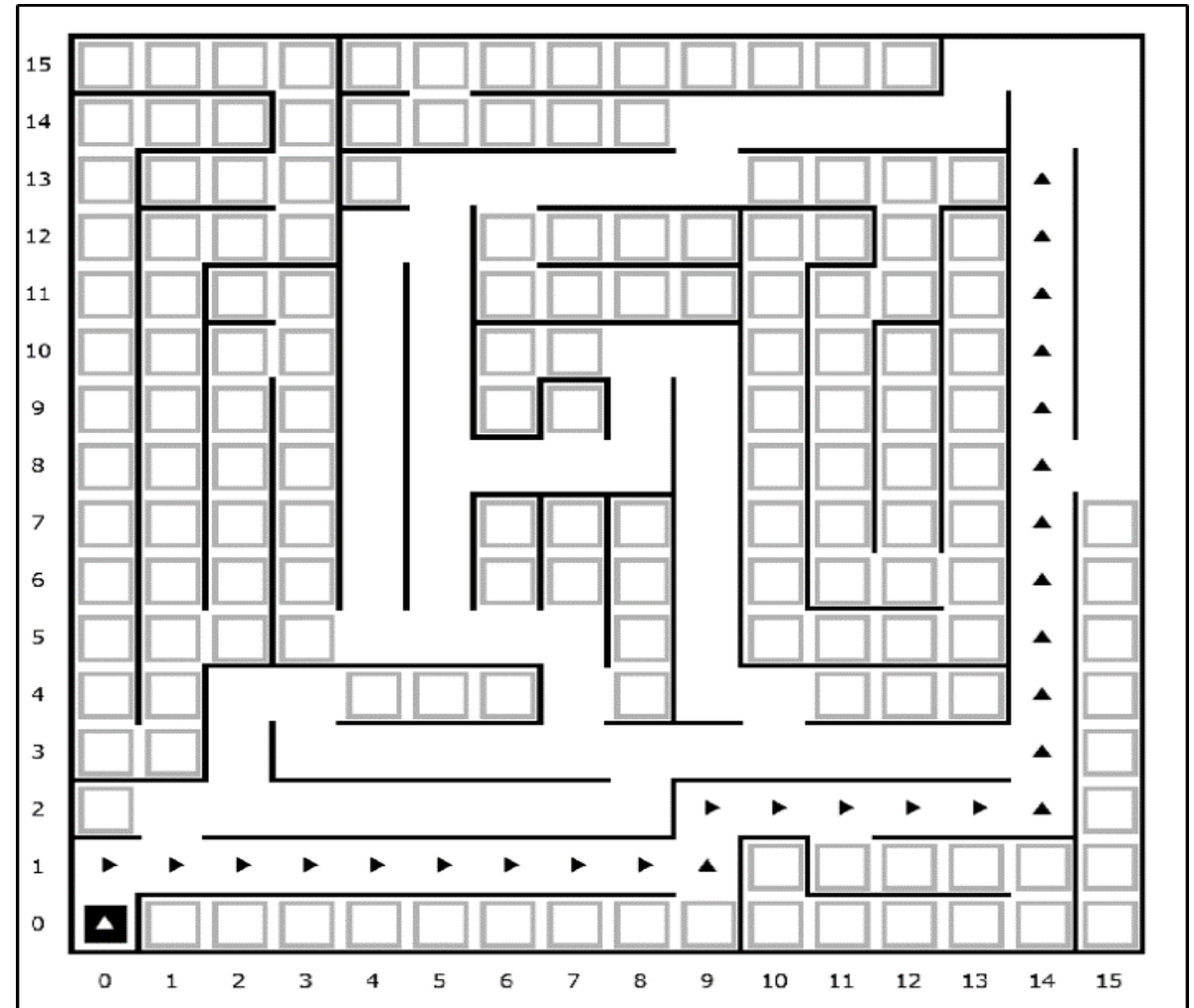
# Analysis and Discussion (Dead-End Exclusion Process) – [6]

- Cells with box lead towards dead-end
- Path which leads to goal are formed from the box-less cells
- Numbers represents the cost value of the cell
- Cells with lower cost are given higher priority by the robot while moving
- The information of the whole map is stored in memory



# Analysis and Discussion (D\*-Lite Process) – [1]

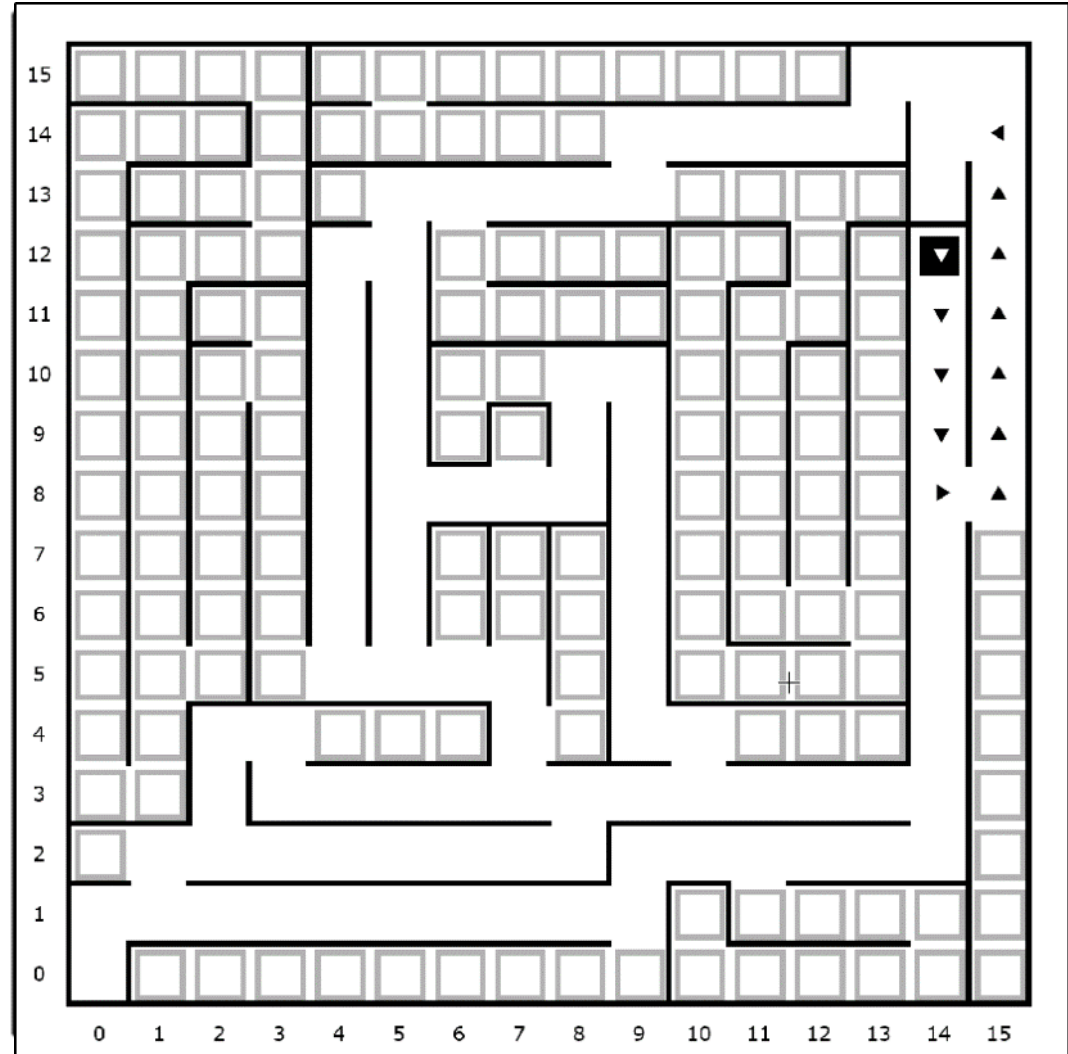
- Bottom left corner is starting position
- Top right corner is goal position
- In a maze without obstacles, the robot follows the shortest path to the goal





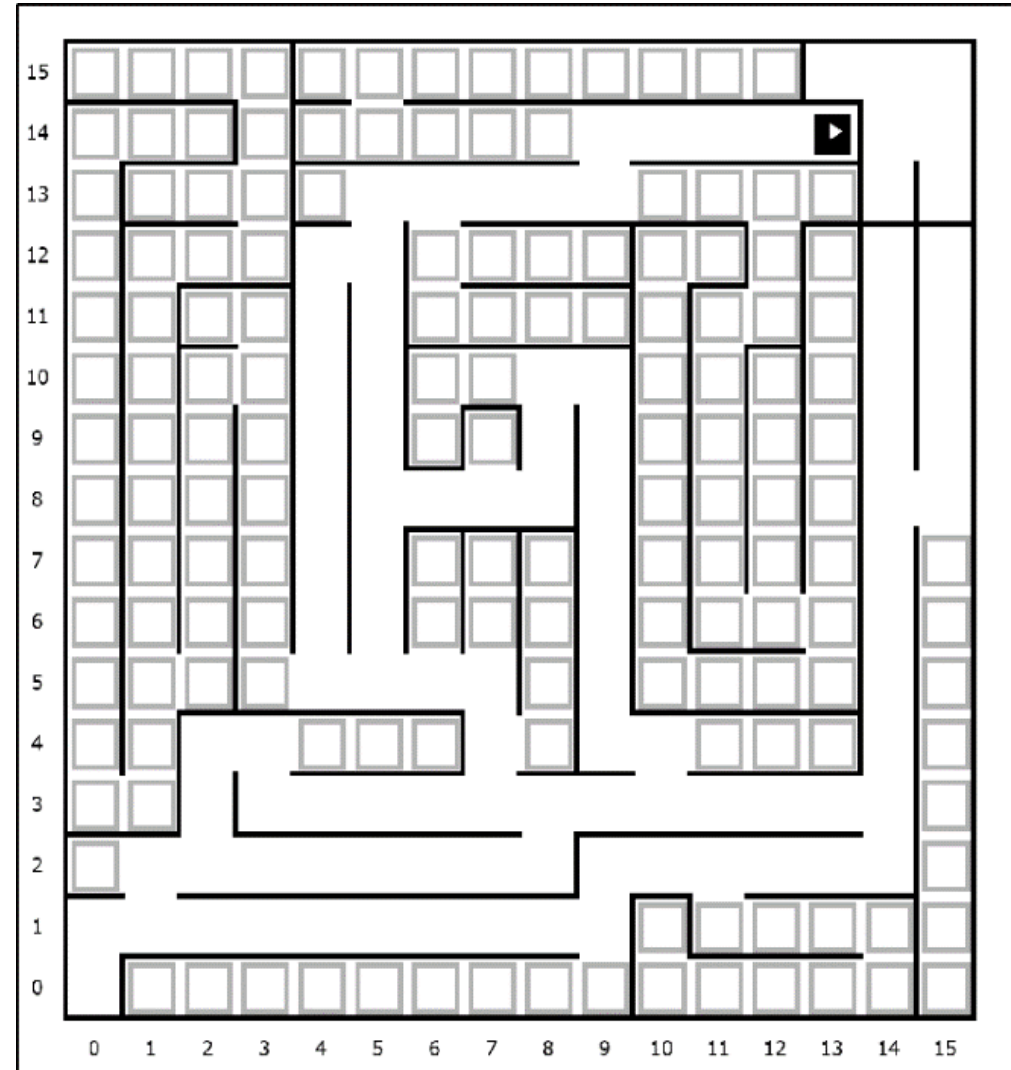
# Analysis and Discussion (D\*-Lite Process) – [2]

- Maze with obstacles and alternative routes:
  - Robot discovers the obstacles as a wall in its path in between the cells (14,12) and (14,13)
  - Bot calculates the next shortest path that leads to the goal



# Analysis and Discussion (D\*-Lite Process) – [3]

- Maze with obstacles and no alternative route:
  - Robot discovers the obstacles in its path
  - The robot keeps moving until remaining obstacles are found in its path
  - After all obstacles in its path have been exhausted, the robot stops



# Future Enhancements

- For more efficient movement, the chassis could be made circular
- Robot could be made to move diagonally to access 8 cells at a time
- By using an aerial camera, the removal as well as addition of real-time obstacles can be relayed to the robot
- For goal-seeking, sampling-based algorithms like Rapidly Exploring Random Trees (RRT) and RRT\* can be used

# Conclusion

- In the designing phase, the robot and maze were simulated in a virtual environment
- Dead-End exclusion algorithm was used for maze exploration
- Goal seeking was executed by using D\*-Lite algorithm
- Obstacles that were added to the maze were detected and avoided in real-time
- All of the project objectives were successfully completed

# Project Schedule (Gantt Chart)

Project Start Date	Sep,2020	Project End Date	Feb,2021				
Task	Progress	Sep	Oct	Nov	Dec	Jan	Feb
	(%)						
Brain Storming and Topic Discussion	100						
Documentation	100						
Follow Webots Tutorial	100						
Learn Maze Solving Robots in Webots	100						
Learn Dead-End Exclusion Algorithm	100						
Learn D*-Lite Algorithm	100						
Maze 3D Structure Design	100						
Robot Structure Design	100						
Program Robot Control	100						
Program Dead End Exclusion Algorithm	100						
Test and Debug Dead End Exclusion Algorithm	100						
Program D*-Lite Algorithm	100						
Test and Debug D*-Lite Algorithm	100						

# References – [1]

X. Li, X. Jia, X. Xu, J. Xiao and H. Li, "An improved algorithm of the exploring process in Micromouse Competition," in School of Automation Science and Electrical Engineering, Beijing, 2010.

A. T. Le and T. T. Le, "Search-Based Planning and Replanning in Robotics and Autonomous Systems," in *Advanced Path Planning for Mobile Entities*, IntechOpen, 2017, pp. 63-89.

A. Stentz, "Optimal and Efficient Path Planning for Partially-Known Environments," in *IEEE International Conference on Robotics and Automation*, San Diego, 1994.

# References – [2]

S. Karaman and E. Frazzoli, "Sampling-based algorithms for optimal motion planning," *The International Journal of Robotics Research*, vol. 30, no. 846, pp. 846-894, 2011.

K. R. Kozlowski, "RRT-path – A Guided Rapidly Exploring Random Tree," in *Robot Motion and Control*, London, Springer-Verlag London, 2009, pp. 307-316.