

Warehouse Simulation

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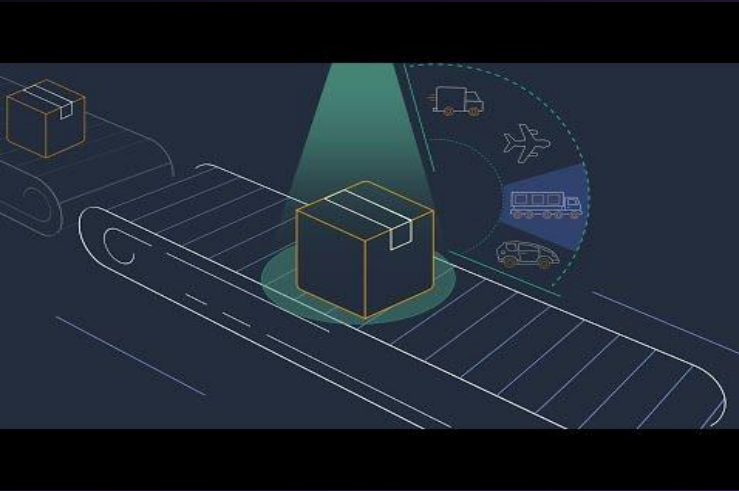
under the guidance of
Dr. Rahul Kala



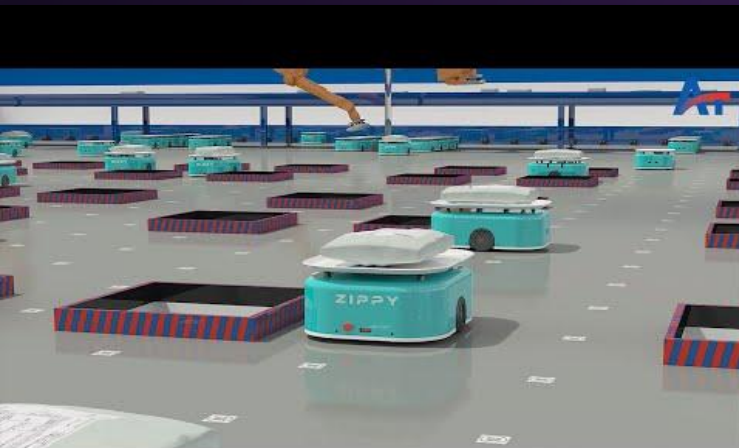
Simulation of Warehouse Robots

Our main aim is to simulate robots in a way such that they are able to successfully simulate a real working environment in a warehouse.



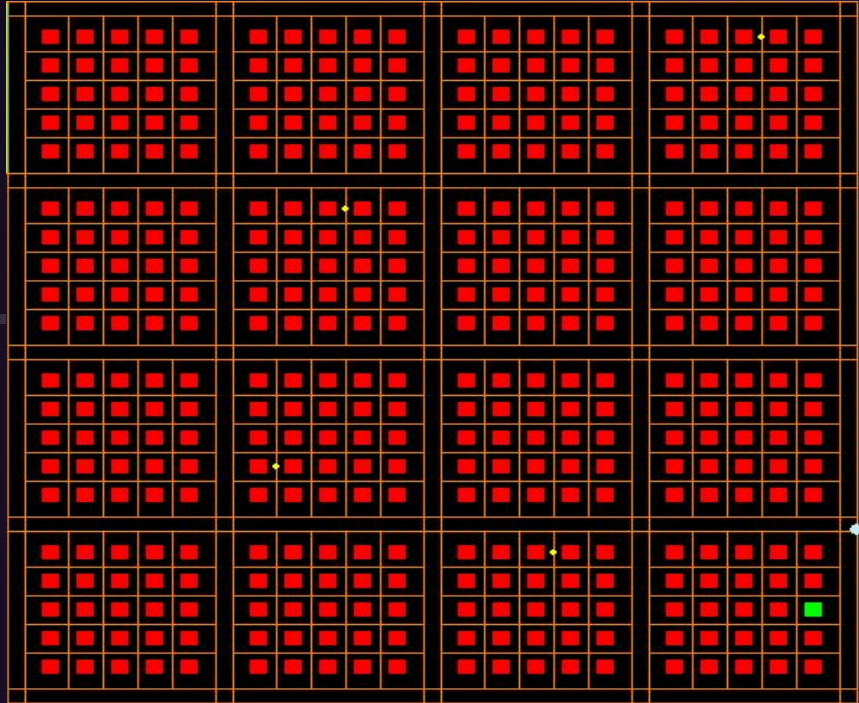


- **Ordering Mechanism**
(Ref - Amazon Fulfillment Center)



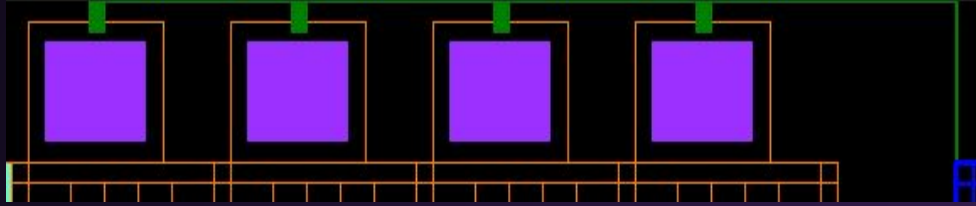
- **Sorting Mechanism**
(Ref - Addverb Technologies)

SIMULATOR OUTLINE

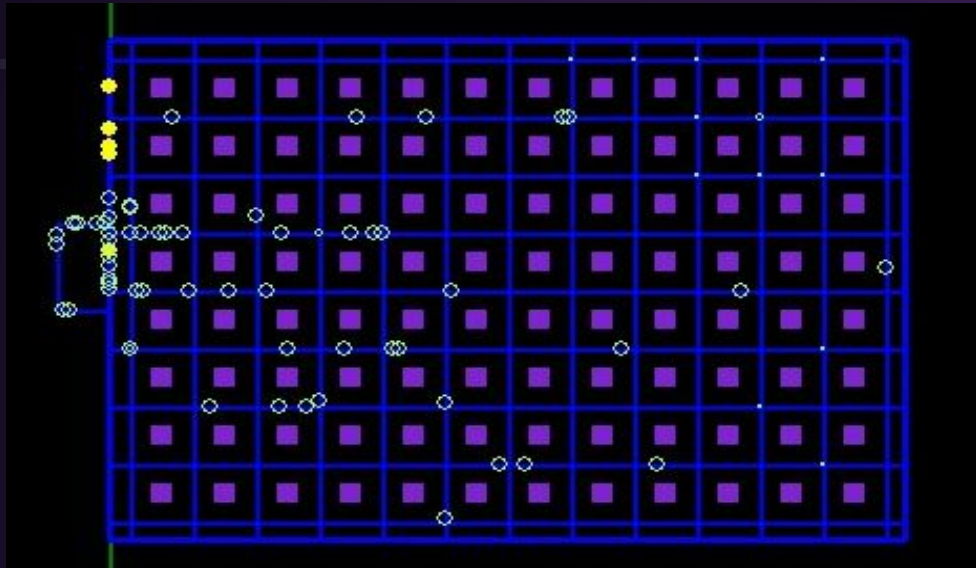


- ITEM STORAGE AREA OF WAREHOUSE

SIMULATOR OUTLINE



- HUMAN COUNTER

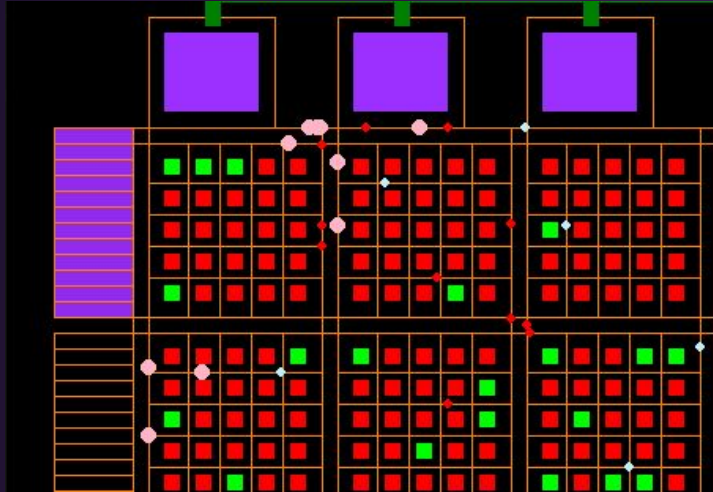
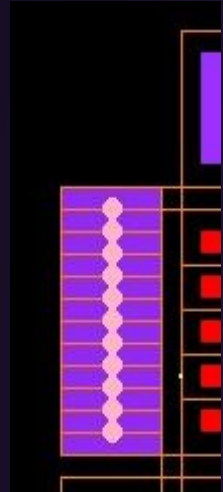


- SORTING ZONE

SIMULATOR OUTLINE



- CHARGING ZONE



- TRUCK BOTS

APPROXIMATE COMPARISON

| OUR SIMULATOR | MICRO FULFILLMENT CENTRE |
|---|---|
| 10 pixels | 1 m |
| 10 timesteps | 1 second |
| Speed → 1 pix/timestep → 1 m/s | Speed → 1.5 m/s |
| Battery Life → 6.6 min | Battery Life → 8 Hours |
| Charging Time → 2000 timesteps → 3.3 min | Charging Time → 30 mins |
| Workshop Size(Variable) → 500 pixel*500 pixel =2500 m ² = 25000 sq. ft. | Workshop Size(Variable) → 2000 to 50000 sq. ft. |

CONGESTION MANAGEMENT

- Scheme 1 (Without Congestion Management)
- Scheme 2 (With Congestion Management)



Scheme 1 (Without Congestion Management)

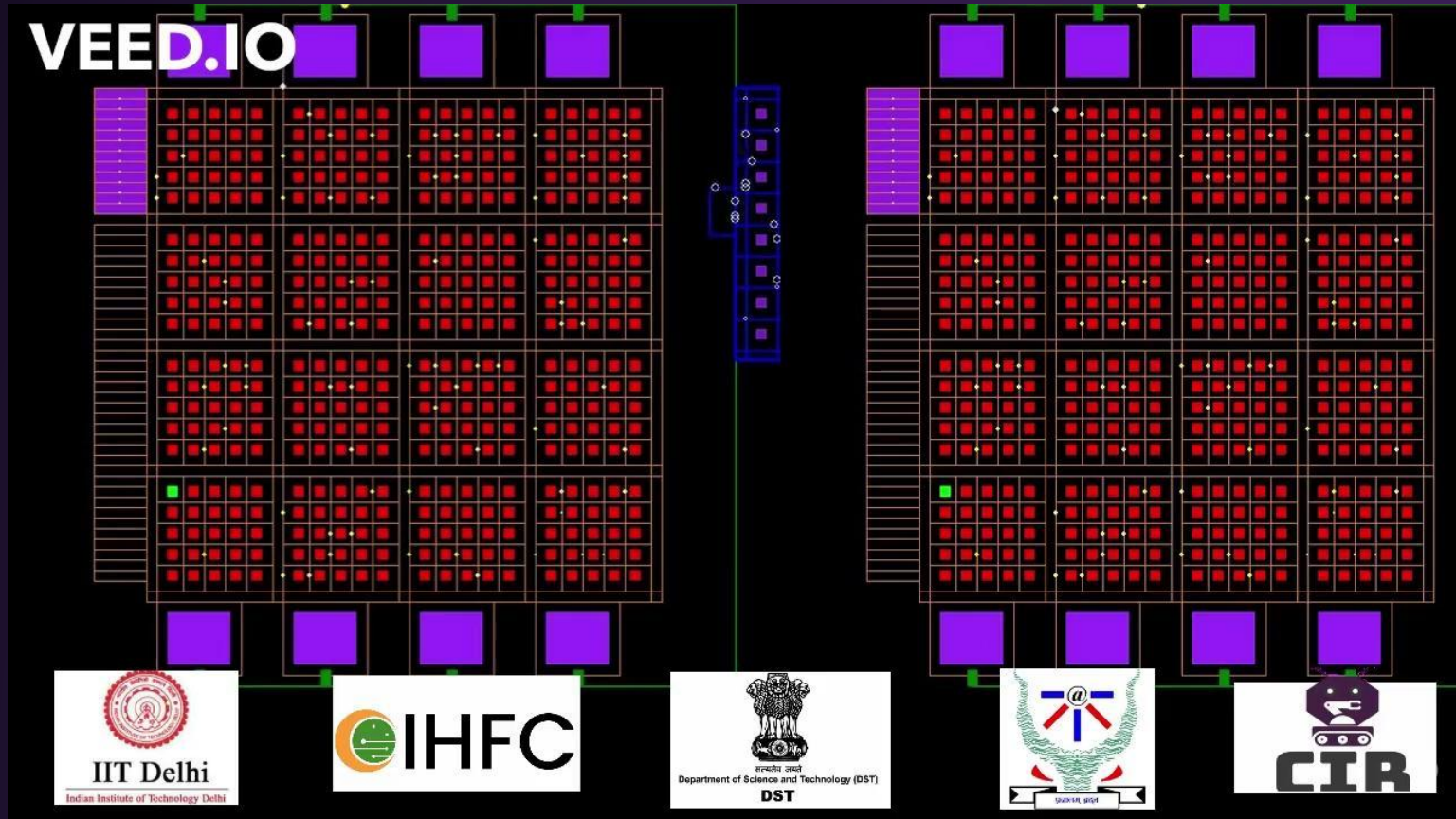
- **Only Shortest Path Matters.**
- **No Replanning after evaluating the Master Plan.**



Scheme 2 (With Congestion Management)

- **Shortest Path and Heat Value of Path both Matters.**
- **Do Re-planning if Congestion around the agent is high.**

CONGESTION MANAGEMENT Demo



INDUCED CONGESTION

Description:

We vary the number of Agents and to induce congestion every order was assigned to go to a single human counter with Number of Orders=100.

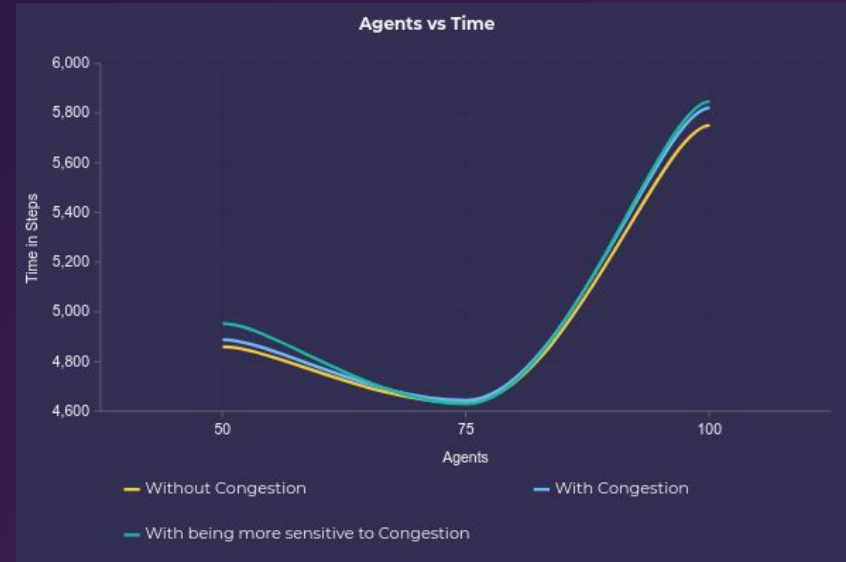


| Number of Agents | 4 | 10 | 25 | 50 | 75 | 100 |
|--------------------|-------|-------|-------|-------|-------|-------|
| Without Congestion | 98501 | 38750 | 17878 | 13670 | 15070 | 16237 |
| With Congestion | 99338 | 41773 | 17887 | 13304 | 14469 | 15637 |

TEST -2 (NORMAL SCENARIO)

Description:

We vary the number of Agents and this time the human counters were allotted to each order in a random fashion with Number of Orders equal to 100.



| Number of Agents | 4 | 10 | 25 | 50 | 75 | 100 |
|---|-------|-------|------|------|------|------|
| Without Congestion | 38062 | 16238 | 7418 | 4862 | 4636 | 5752 |
| With Congestion | 38492 | 16320 | 7355 | 4890 | 4646 | 5823 |
| When being more sensitive to Congestion | 38095 | 16392 | 7485 | 4955 | 4632 | 5849 |

INTERSECTION MANAGEMENT

- Scheme 1 (Normal Intersection Management)
- Scheme 2.1 (Partially Randomized Intersection Management with $\text{Epsilon} = 0.5$)
- Scheme 2.2 (Partially Randomized Intersection Management with $\text{Epsilon} = 0.75$)
- Scheme 3 (Fully Randomized Intersection Management)



Scheme 1 (Normal Intersection Management)

- Prefer the lane in which there are more number of cars waiting.
- More Deterministic
- There is a chance of starvation in this.

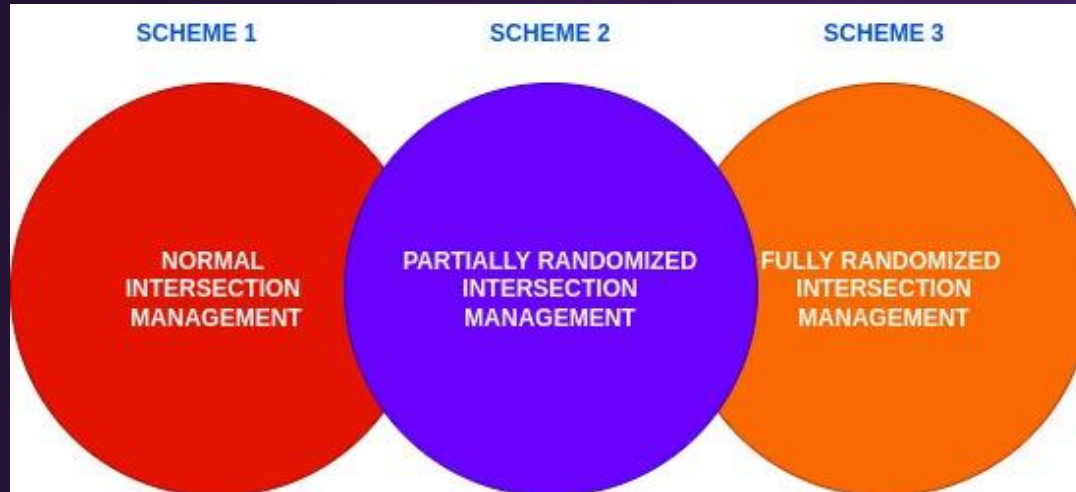
Scheme 2 (Partially Randomized Intersection Management)

- Introduced a Probability Factor (ϵ) with which we did the Random Choosing and otherwise follow the Scheme 1.
- Flavor of Randomization expected to improve Results.

Scheme 3 (Fully Randomized Intersection Management)

- Just for testing the result of Randomization to maximum extent, we made the value of Probability Factor (ϵ) to be 1. So, it always behaves in a random way.

VENN DIAGRAM OF ALL SCHEMES



TESTING INTERSECTION MANAGEMENT

Test Description

- Number of Agents = 300
- Number of Items in Warehouse = 300
- Number of Test Cases = 10
- Total Number of Orders for Testing = $300 \times 10 = 3000$ Orders

RESULTS

| Scheme | Test - 1 | Test - 2 | Test - 3 | Test - 4 | Test - 5 | Test - 6 | Test - 7 | Test - 8 | Test - 9 | Test - 10 |
|---|----------|----------|----------|----------|----------|----------|----------|----------|----------|-----------|
| Normal Intersection Management | 12098 | 11449 | 10683 | 8712 | 8871 | 8330 | 9142 | 9424 | 10186 | 8222 |
| Partially Randomized Intersection Management (epsilon=0.5) | 10477 | 12383 | 10585 | 9790 | 9258 | 8416 | 9664 | 8994 | 8841 | 8486 |
| Partially Randomized Intersection Management (epsilon=0.75) | 11184 | 9821 | 9956 | 8982 | 9324 | 8087 | 10381 | 9735 | 9285 | 8677 |
| Fully Randomized Intersection Management | 10129 | 11432 | 10488 | 9478 | 8398 | 9235 | 10116 | 9468 | 9497 | 8463 |

RESULTS (Cont.)



| Scheme | Average Steps |
|---|---------------|
| Normal Intersection Management | 9712 |
| Partially Randomized Intersection Management (epsilon=0.5) | 9689 |
| Partially Randomized Intersection Management (epsilon=0.75) | 9543 |
| Fully Randomized Intersection Management | 9670 |

Item Placement Strategies

Scheme 1 (Random Fashion)

- Randomly Distributed Items

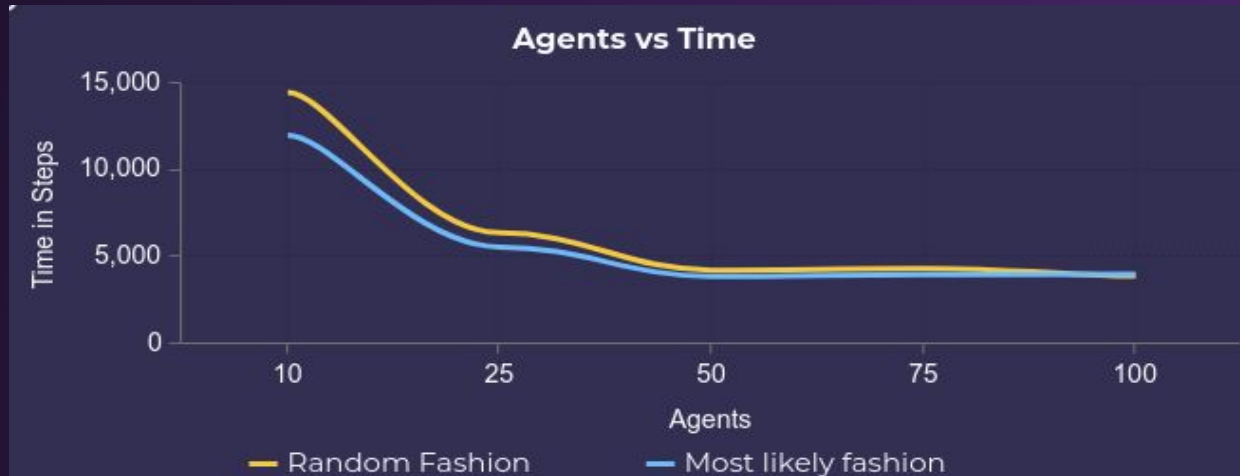
Scheme 2 (Most Likely Fashion)

- Items most likely to be ordered are near to the human counter.
- Intuitively reduces timesteps but in actual there is a tradeoff between congestion and timesteps.

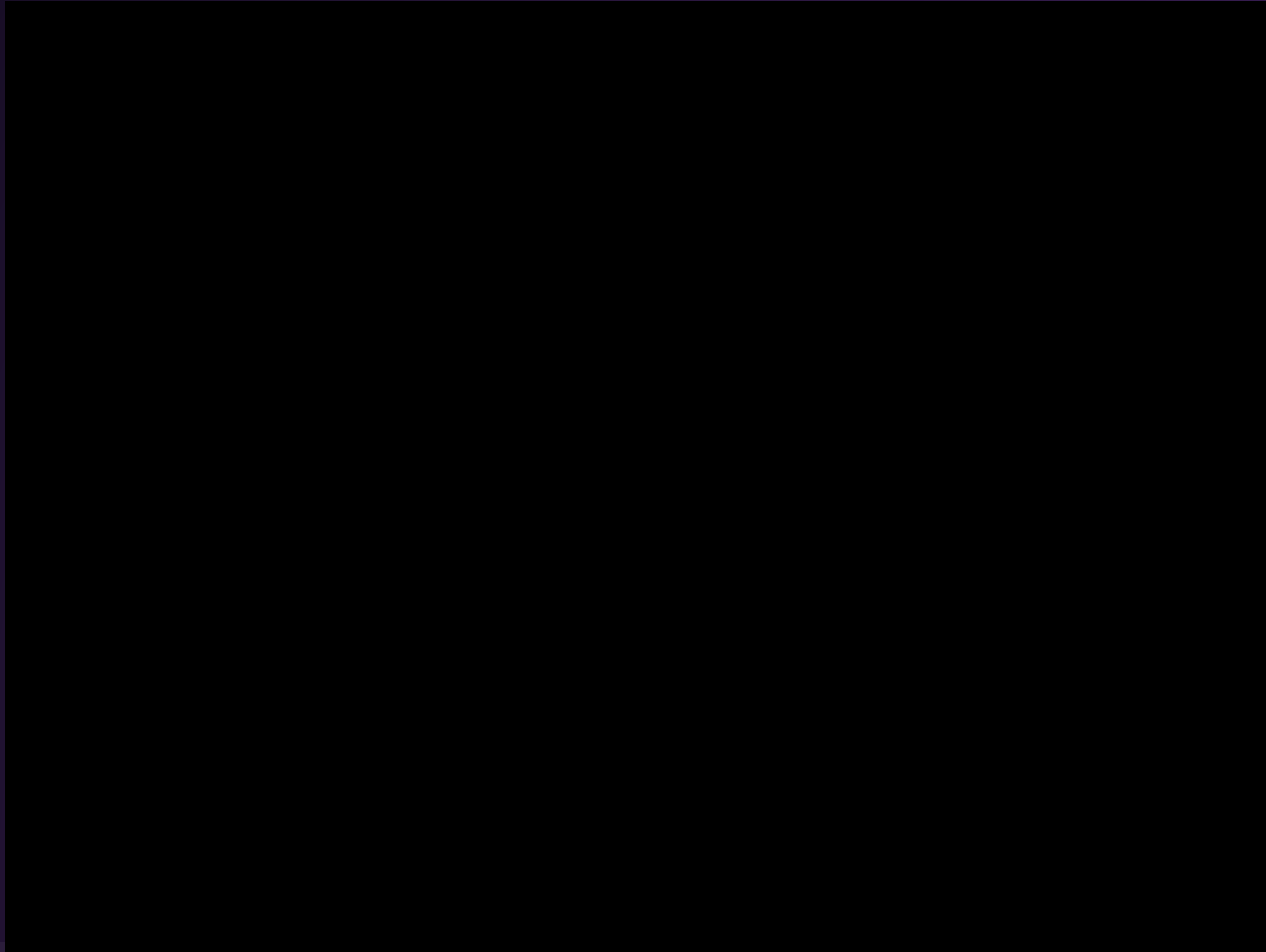
Item Placement Strategy

Number of Items = 100
Items Ratio: 9:1

| Number of Agents | 10 | 25 | 50 | 75 | 100 |
|---------------------|-------|------|------|------|------|
| Random Fashion | 14485 | 6401 | 4258 | 4354 | 3918 |
| Most likely Fashion | 12035 | 5592 | 3891 | 3993 | 4014 |



Item Placement Strategy Demo



Result Comparison with Actual Warehouse

Real Life → One day output → 5000 Orders per Day in 25000 sq ft Semi-Automated mini Fulfillment Centres

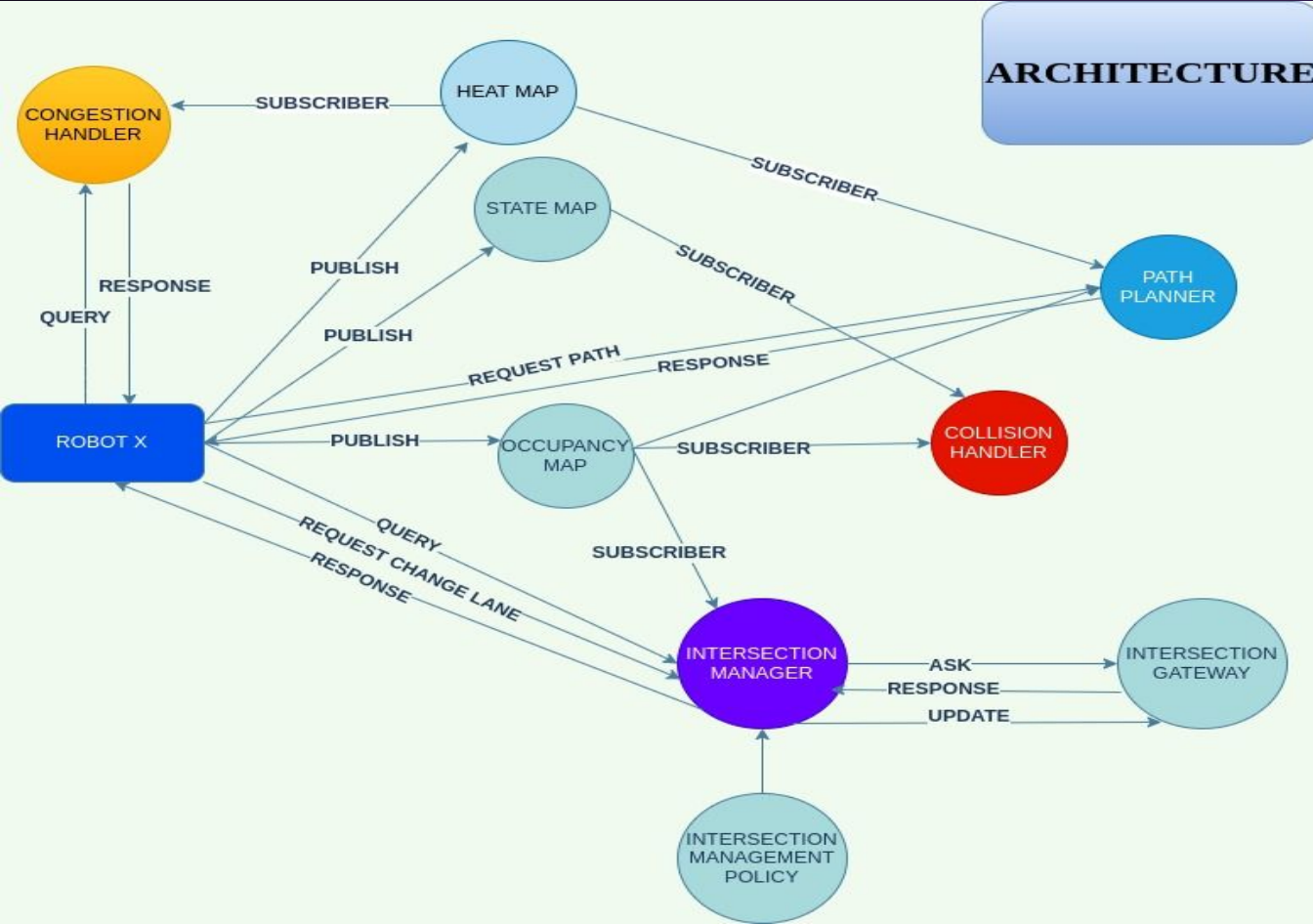
**Our Simulator → Average Time for 100 orders = 10000 Timesteps = 1000 sec
Now, in 24 hours → Orders = $24 \times 60 \times 60 \times 100 / 1000 = 8640$ Orders Per day in 25000 sq ft Fully-Automated Simulator**



ARCHITECTURE



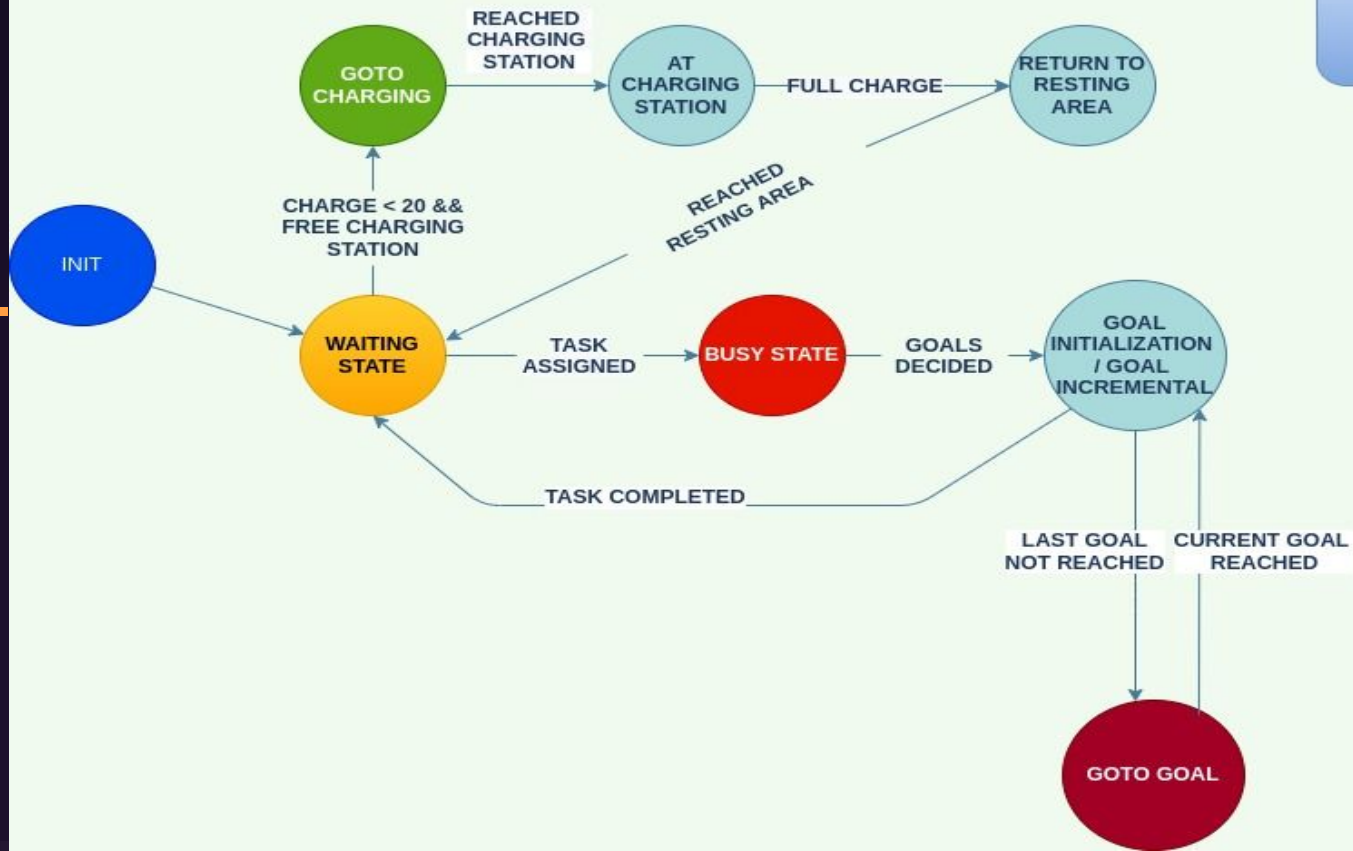
OVERALL ARCHITECTURE



- PUBLISHER-SUBSCRIBER MODEL
- QUERY-RESPONSE SERVICE

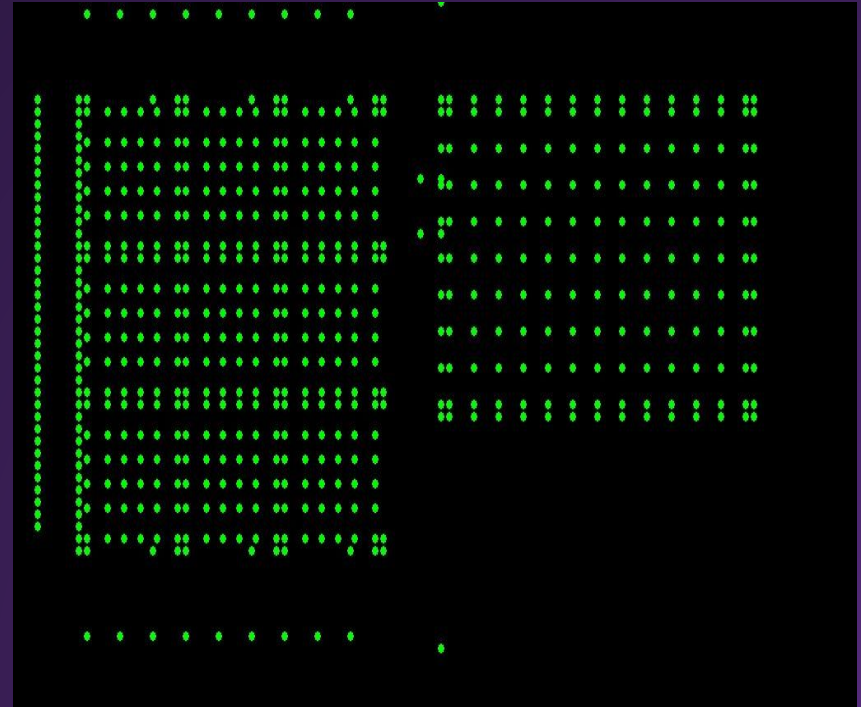
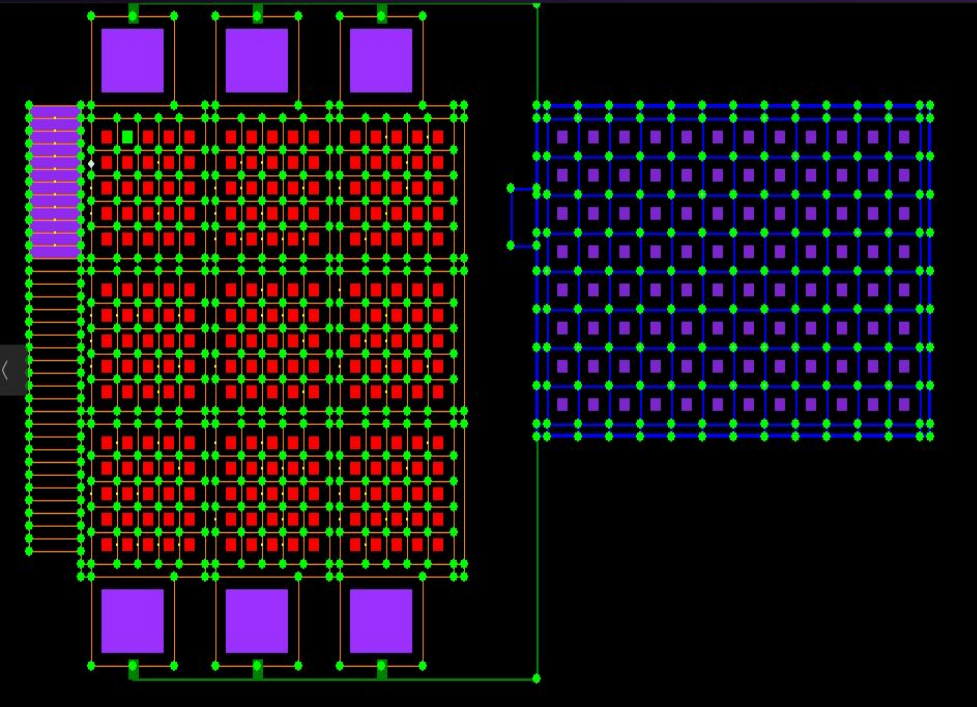
BFSM MODEL

BFSM



PATH PLANNING

GRAPH ABSTRACTION



3 PHASES OF PATH PLANNING

- 1) **Accessibility (Access Point)** - From the point where we are starting the journey, it is not necessary that the source is in our Roadmap. So in our Grid, we need to find the nearest Point to the Source which is in the Roadmap and that point would be the nearest intersection to that Point. So, using BFS we do the task of finding the access point for our journey.
- 2) **Connectivity** - On reaching the Access Point, we apply A* Algorithm using heuristic as a linear combination of Heat Values and Manhattan Distance from source to Goal. Now we will get a Path but in the Roadmap domain so we need to convert the Path to Workspace Connectivity Graph to move the agent. After this Phase, we will either reach the Goal or a point in the Roadmap Graph that is nearest to Goal.
- 3) **Departability (Depart Point)** - If the Goal we are planning for is not in the Roadmap Graph, then we need to again find the simple straight path to the Goal.

PSEUDO CODE FOR GOTO GOAL CONTROLLER

```

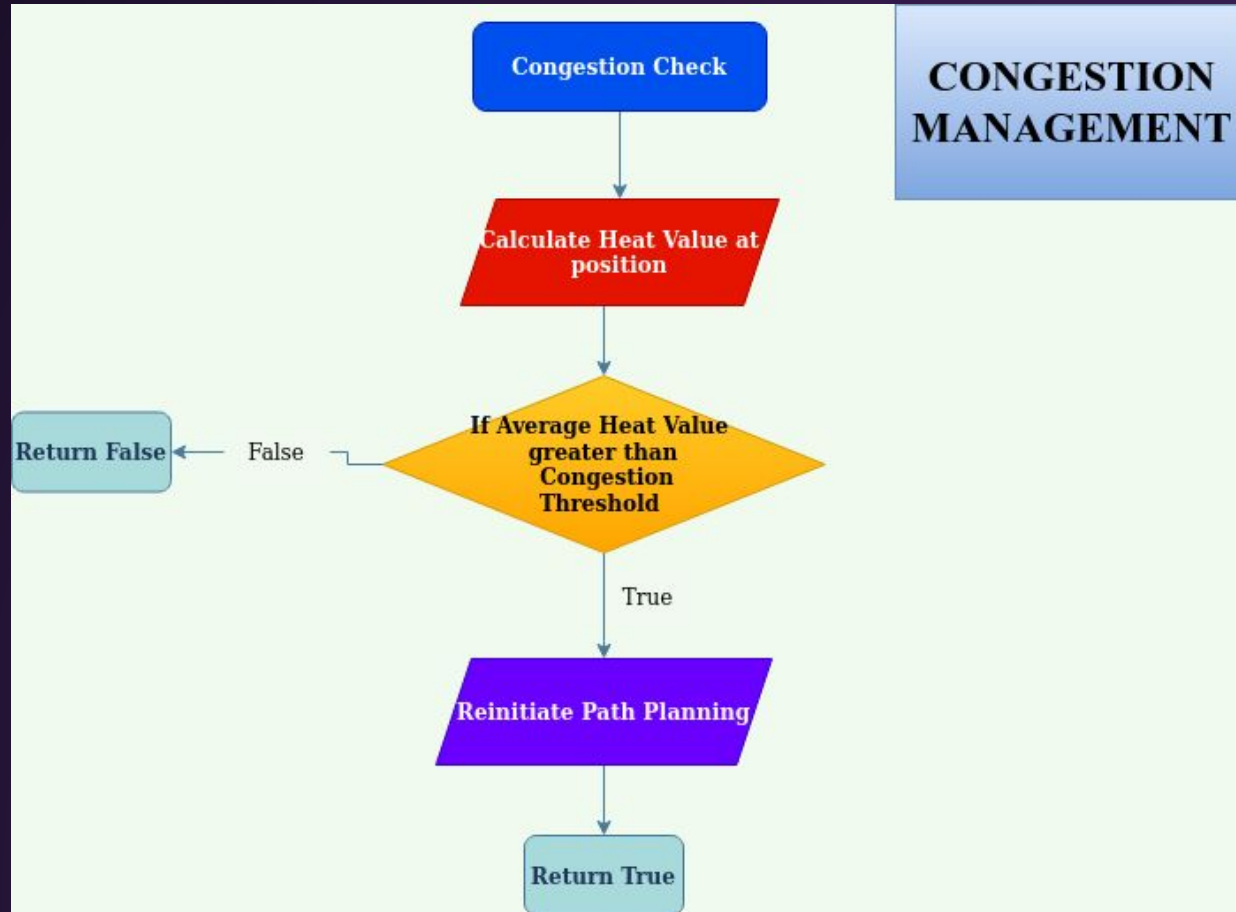
    ● ● ●
    τav--> Path to travel on

    function Move(Agent):
        flag=1
        if τav is not empty:
            Ghost_Robot<-- Agent
            Ghost_Robot.position=τav[1]
            if Collision_Check(Ghost_Robot.position) is True:
                return (Vx=0,Vy=0)
            if Ghost_Robot is at Intersection:
                if Intersection_Management(request=False,query=True,Ghost_Robot.position) is not
road(Agent.Position):
                    Intersection_Management(request=True,query=False,Ghost_Robot.position)
                    flag=0
            if flag == 1:
                if Congestion_Management(Agent.position) is True:
                    τav=[]
                    return (Vx=0,Vy=0)
                else:
                    τav.pop_front()
                    New = Speed(Ghost_Robot.position,Agent.position)
                    Agent<--Ghost_Robot
                    return New
            else:
                return (Vx=0,Vy=0)
        else:
            τav=Planning(Agent.position,Agent.goal)
            return (Vx=0,Vy=0)

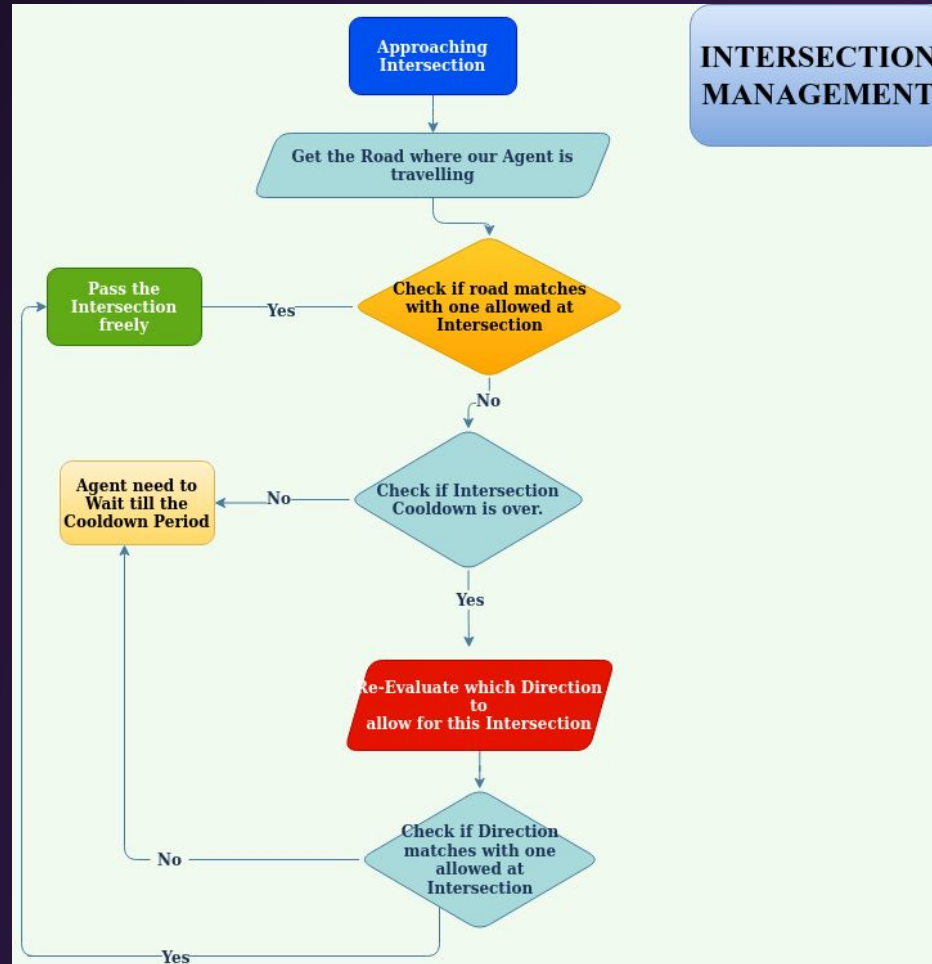
```

```
function Speed(A,B):  
    return Bx-Ax,By-Ay  
  
function Planning(position,goal):  
     $\alpha$ =Path from position to Access point  
     $\beta$ =Path from Access point to Depart point  
     $\delta$ =Path from Depart point to goal  
    return  $\alpha+\beta+\delta$   
  
function Collision_Check(position):  
    if position is Occupied: //Current Position is input from Sensor  
        return True  
    else:  
        return False  
  
function Intersection_Management(request,query,Intersection):  
    if query==True:  
        return road(Intersection)  
    else:  
        if last_time_updation(Intersection) > threshold:  
            Re-Evaluate(Intersection)  
  
function Congestion_Management(position):  
    if Heat(position)>Threshold:  
        return True  
    else:  
        return False
```

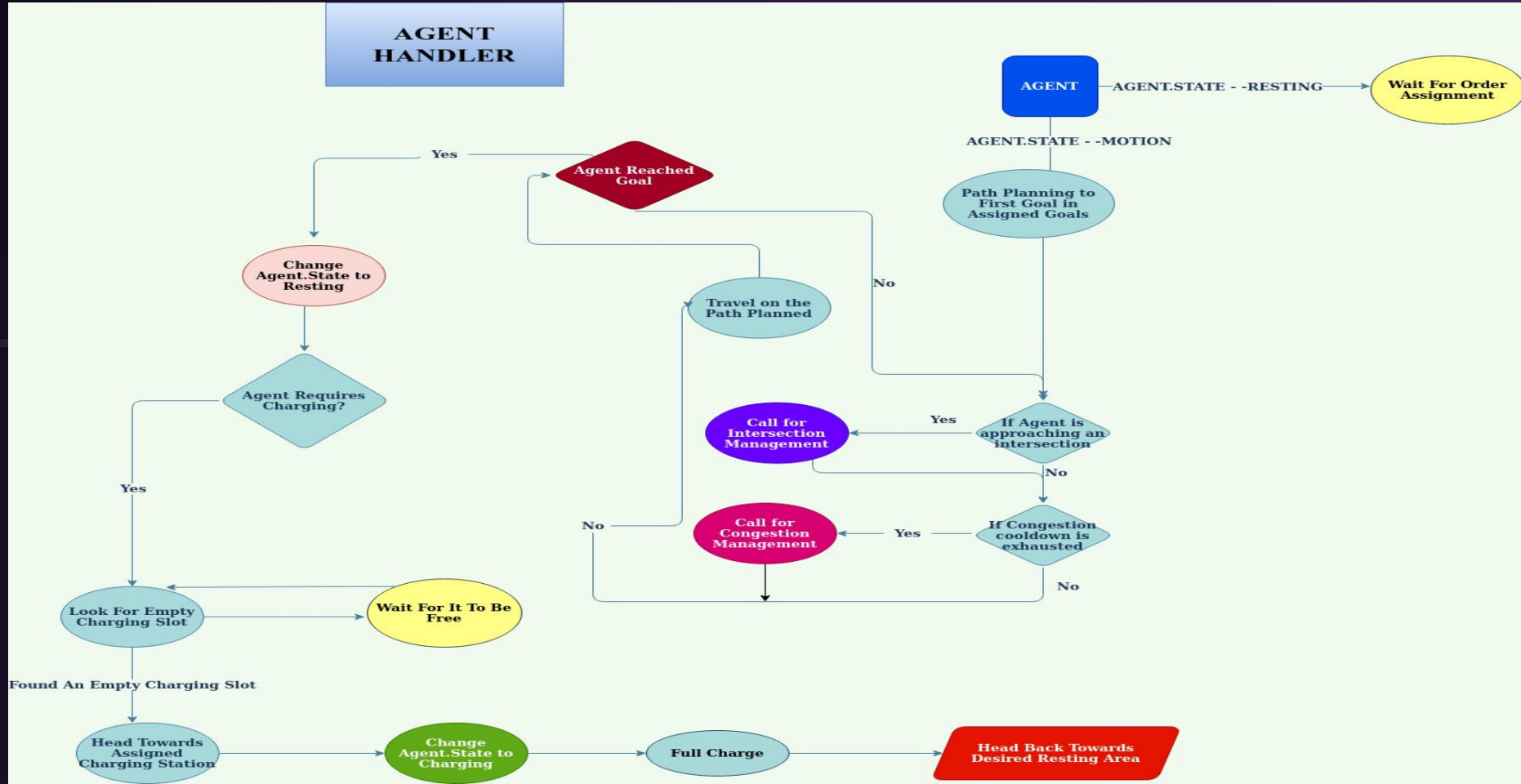
BLOCK DIAGRAM OF CONGESTION MANAGEMENT



BLOCK DIAGRAM OF INTERSECTION MANAGEMENT



BLOCK DIAGRAM OF AGENT HANDLER



CONCLUSION



CONCLUSION

- **Congestion Management:** Moderately Sensitive to Congestion
- **Intersection Management:** Partially Randomized Intersection Management (with Epsilon = 0.75)
- **Item Placement Strategy:** Random Fashion when many agents and Most Likely Item near Counter when less agents

THANK YOU!!

