

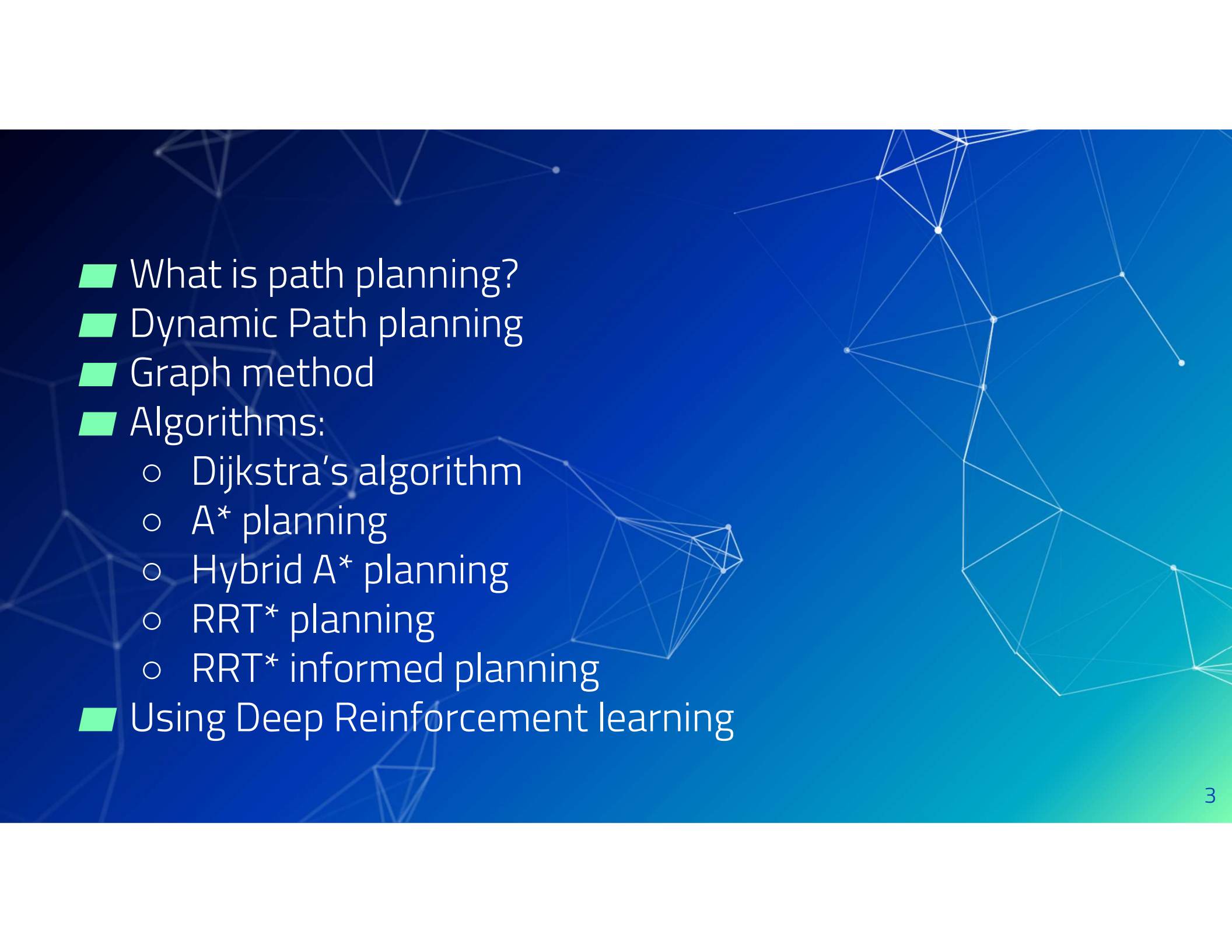


# PATH PLANNING



# Agenda

Topics to be touched upon briefly...

- 
- What is path planning?
  - Dynamic Path planning
  - Graph method
  - Algorithms:
    - Dijkstra's algorithm
    - A\* planning
    - Hybrid A\* planning
    - RRT\* planning
    - RRT\* informed planning
  - Using Deep Reinforcement learning



## What is path planning?

Dynamic Path planning

Graph method

Algorithms:

- Dijkstra's algorithm
- A\* planning
- Hybrid A\* planning
- RRT\* planning
- RRT\* informed planning

Machine learning

Velocity planning



Process of constructing a  
**shortest possible** path  
connecting destination and  
avoiding the detected obstacles





■ What is path planning?

■ Dynamic Path planning

■ Graph method

■ Algorithms:

- Dijkstra's algorithm

- A\* planning

- Hybrid A\* planning

- RRT\* planning

- RRT\* informed planning

■ Using Deep Reinforcement learning

Setting Local  
and  
Global goal



Finding shortest  
path connecting  
destination



Velocity  
Planning



■ What is path planning?

■ Dynamic Path planning

■ Graph method

■ Algorithms:

- Dijkstra's algorithm

- A\* planning


- Hybrid A\* planning

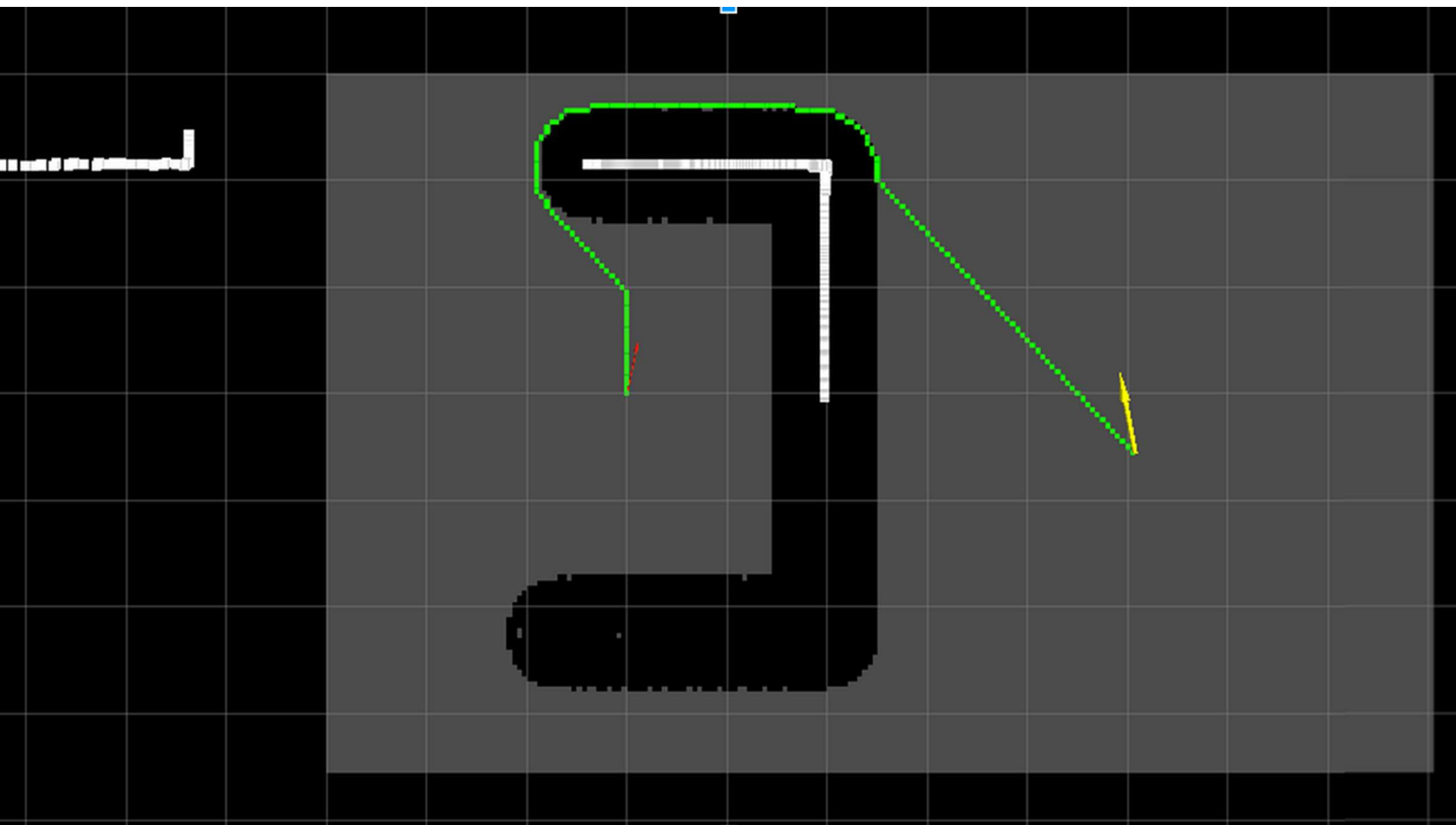
- RRT\* planning

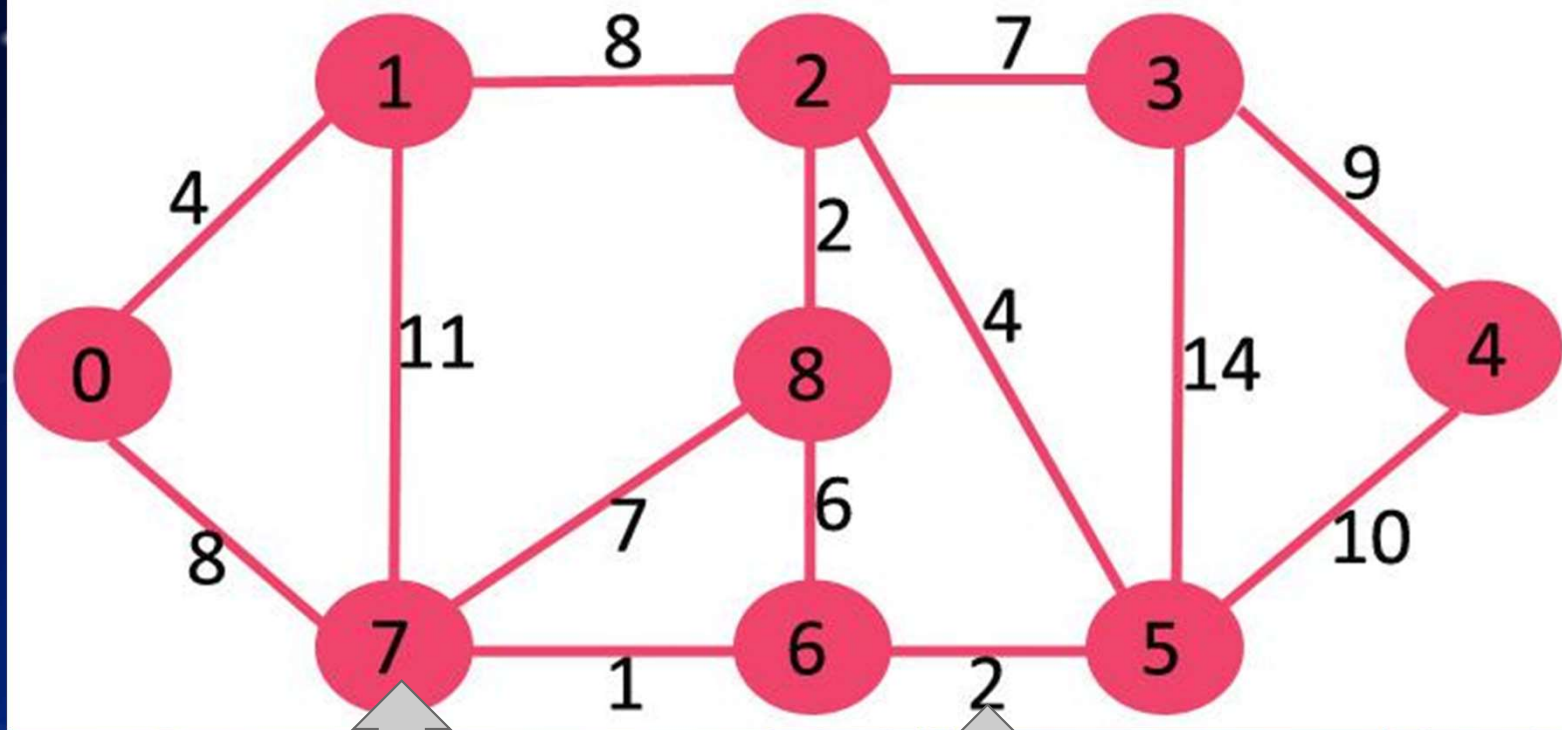
- RRT\* informed planning

■ Using Deep Reinforcement learning



- 
- Obstacles → occupancy grid
  - Cells of occupancy grid as vertices of a graph
  - Cost for changing cells (vertices)
  - Cost ~ Distance to be travelled
  - Algorithms required to find shortest path



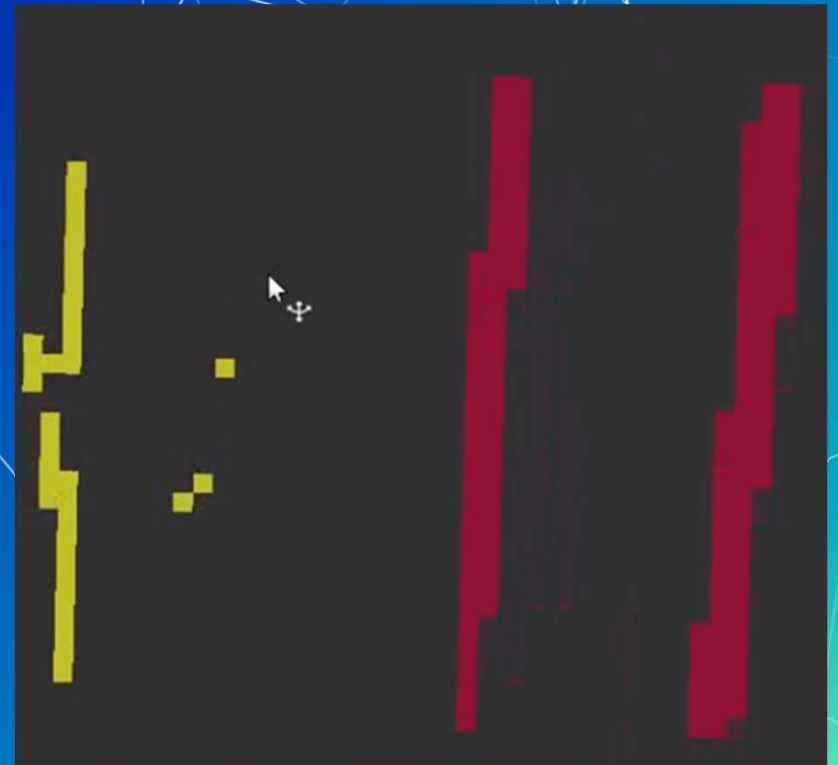


Node /  
Vertex

Cost / Weights

# Real life environment visualization as a graph

- Objects, lanes and other vehicles in occupancy grid
- Each pixel has value ~ it's "occupancy".





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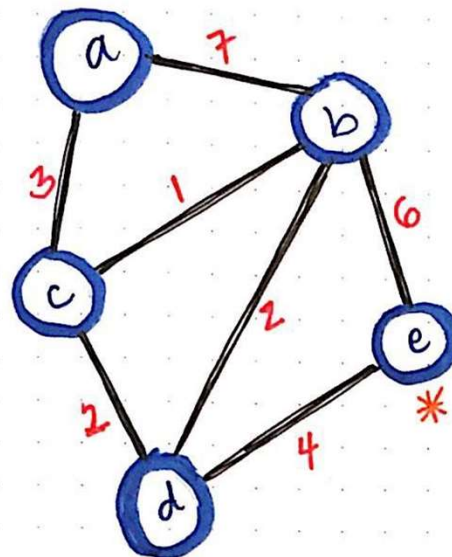
- RRT\* informed planning

■ Using Deep Reinforcement learning



## Dijkstra's algorithm

Uses 'greedy method' to find least cost path to any vertex on the Occupancy Grid

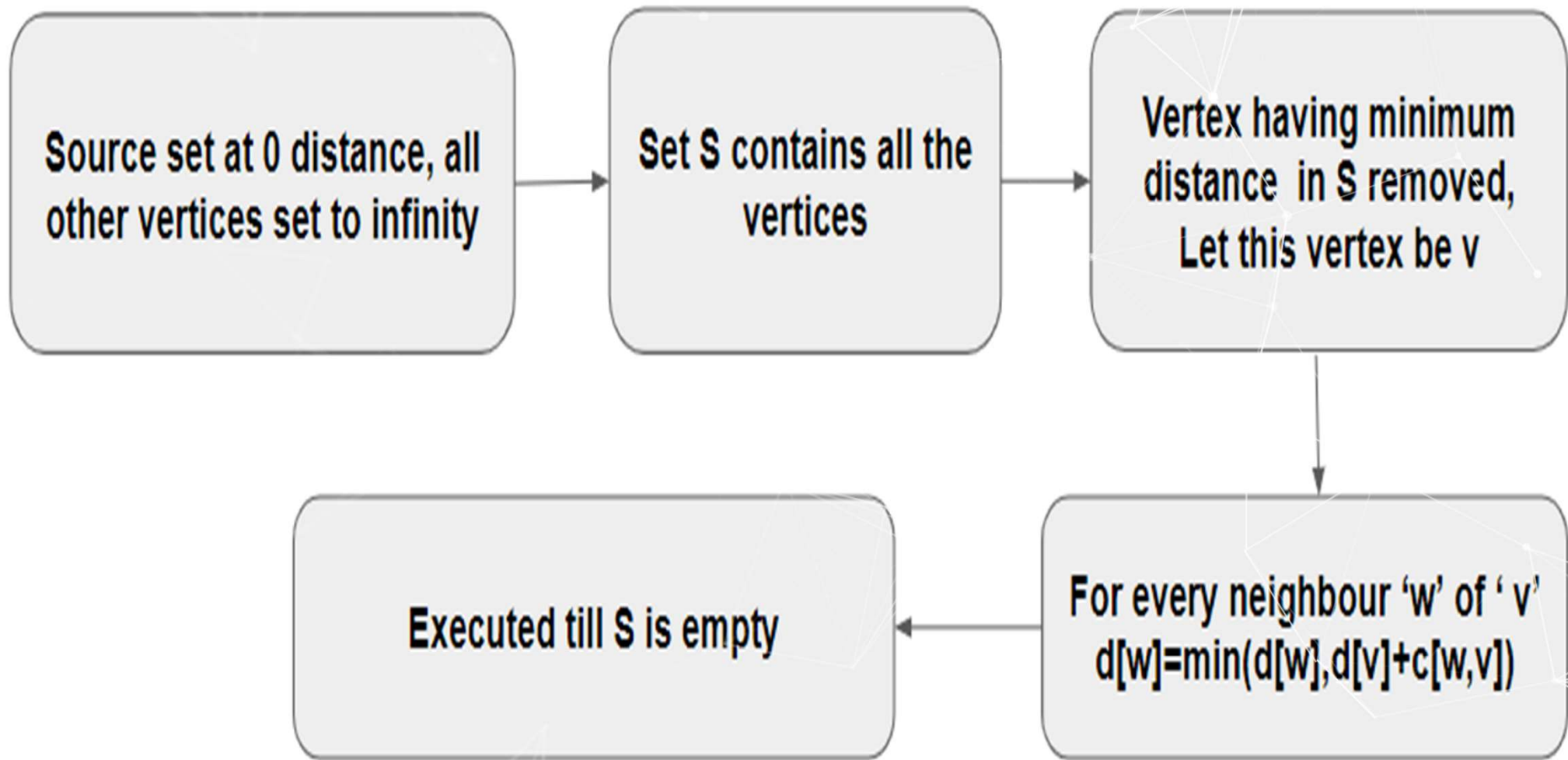


Visited = [a, c, b, d]

Unvisited = [e]  
↑ current vertex

VERTEX	SHORTEST DIST. FROM (a)	PREVIOUS VERTEX
a	0	
b	<del>7</del> 4	<del>a</del> c
c	<del>3</del>	a
d	<del>5</del>	b
e	<del>1</del> 9	<del>b</del> d

\*The only node left to visit is (e). However, all of its neighbors have already been visited, so there's nothing for us to examine or update here!



# ALGORITHM

# Why Dijkstra's Algorithm?

## Advantages

- Simple
- Computationally light
- Good for blind search

## Disadvantages

- Very large processing time for dynamic planning
- Doesn't consider smoothness of path
- Ambiguity with negative weights
  - (Alternative is Bellman-Ford )

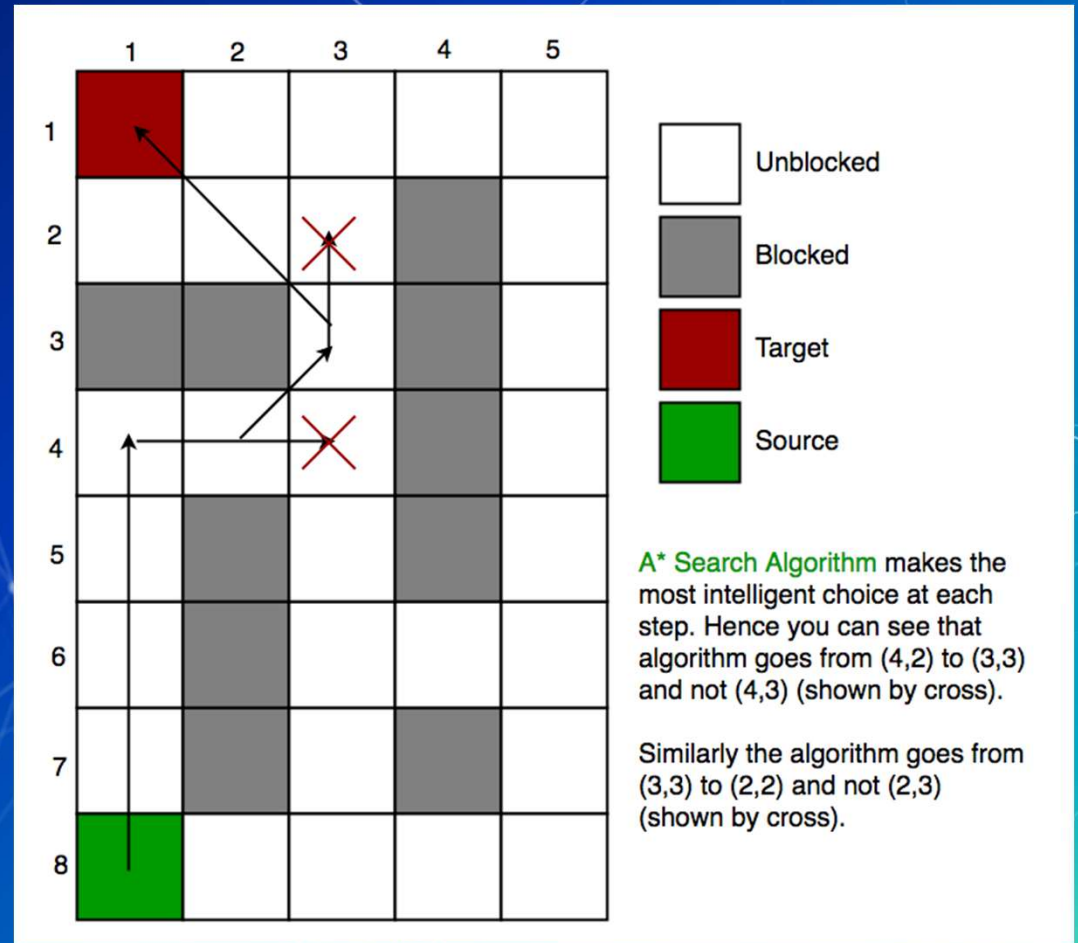
## A\* algorithm

Minimizes 'f-value'.

$f\text{-value} = g\text{-value} + h\text{-value}$

$g\text{-value}$  = Movement cost to reach current node

$h\text{-value}$  = Estimated movement cost to reach the destination node









# Ways to calculate H-value

## Exact Calculation

- High processing time
- All distances required apriori

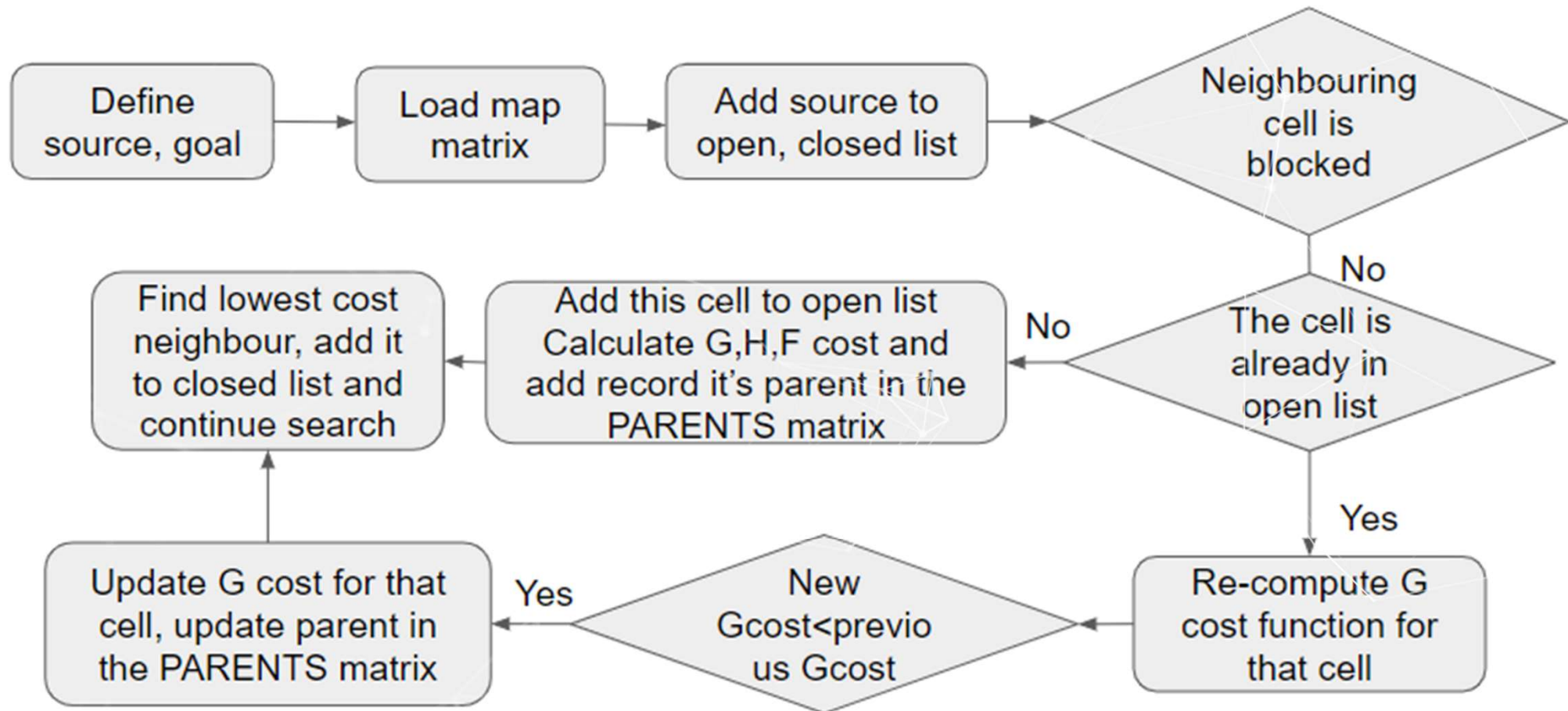
## Approximate calculation

- Calculate Euclidean distance
- Time and resource saving

Then we define 2 sets namely open set, closed set and a Parents matrix.

Parents is a 2D matrix, which should map all the nodes in the open list to it's parent node i.e. the node from which we came to the current node.

# A\* algorithm rough flowchart



# Why A\* Algorithm?

## Advantages

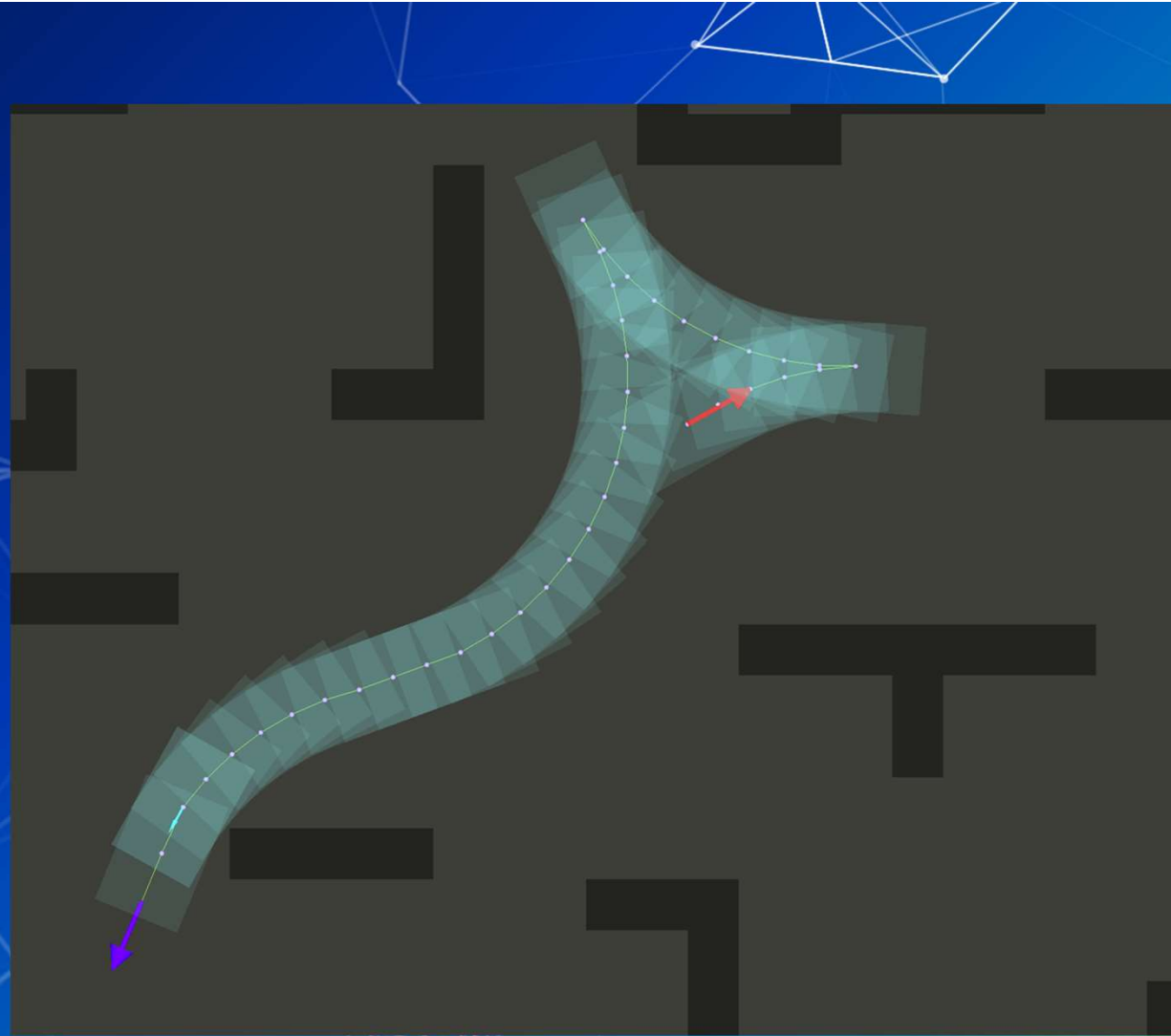
- Intelligent Choice
- Less time complexity

## Disadvantages

- Doesn't consider smoothness of path

## Hybrid A\* algorithm

Smoothness filter over  
A\* algorithm



final\_local\_map

```
sine@sine-ThinkPad-P50: ~/rise_final_pp
rosc... x sine@... x /hom... x sine@... x sine@... x sine@... x sine@... x
distr 49.0467
lane goal pose x: 0 lane goal pose y: 14.7
output_vel data: 1

0 << 14.7
distr 49.0467
lane goal pose x: 0 lane goal pose y: 14.7
output_vel data: 1

0 << 14.7
distr 49.0467
lane goal pose x: 0 lane goal pose y: 14.7
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0 << 14.7
distr 49.0467
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```

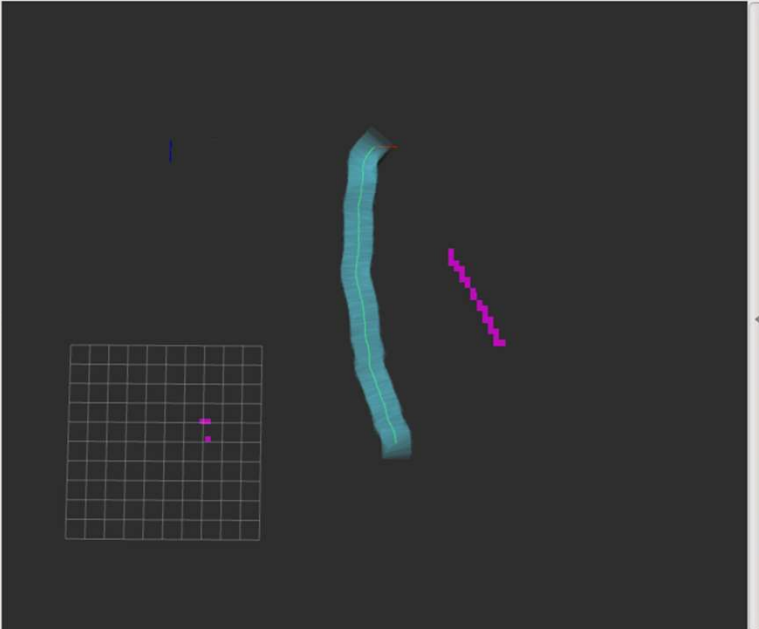
path\_planner.rviz\* - RViz

Interact Move Camera Select Focus Camera Measure 2D Pose Estimate 2D Nav Goal Publish Point

Displays

- Global Options
  - Fixed Frame: map
  - Background Color: 48; 48; 48
  - Frame Rate: 30
  - Default Light: ☒
- Global Status: Ok
  - Fixed Frame: OK
- Grid: ☒
- Map: ☒
- Pose: ☒
- Path: ☒
- MarkerArray: ☒
- Pose: ☒

Add Duplicate Remove Rename

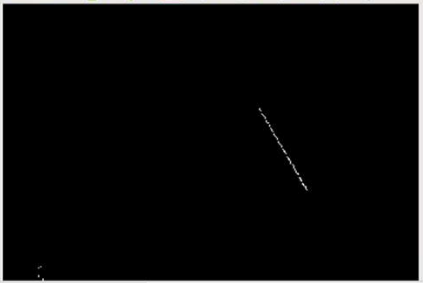


Time

ROS Time: 1522926633.03 ROS Elapsed: 728.18 Wall Time: 1522926633.06 Wall Elapsed: 728.12 Experimental


Reset

local\_map



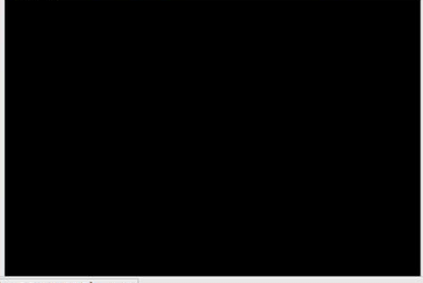
(x=143, v=168) ~ L:0

mapping obstacle



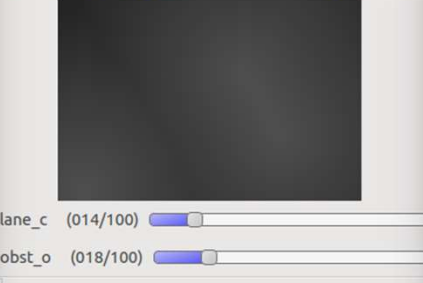
(x=39, v=139) ~ L:0

blown\_local\_map



(x=39, v=139) ~ L:0

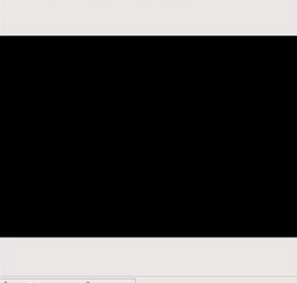
final\_local\_map\_cost



lane\_c (014/100)

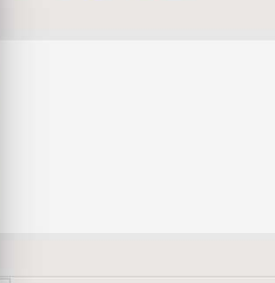
obst\_o (018/100)

final\_local\_map



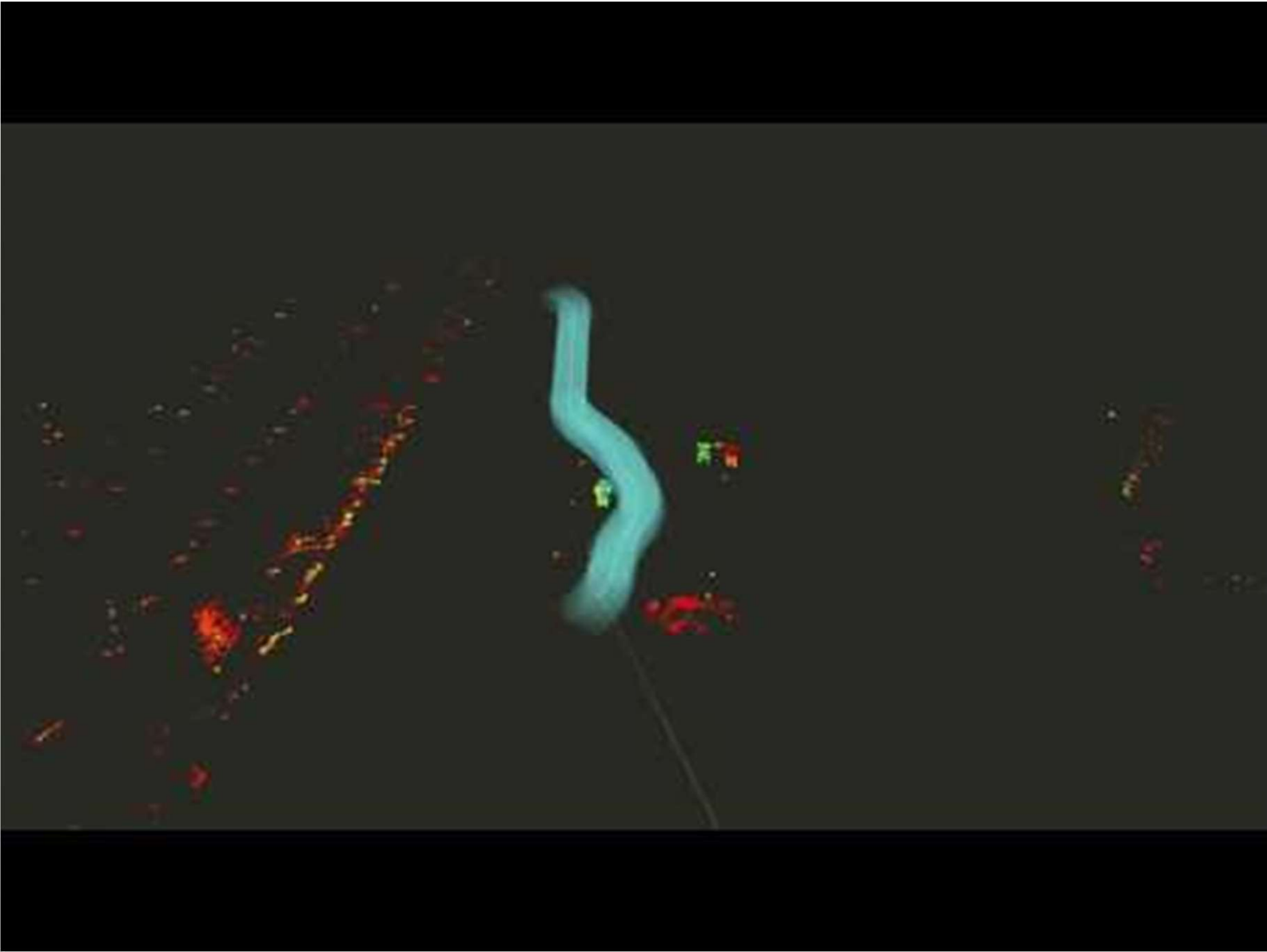
(x=57, v=18) ~ L:0

mapimg lane



31 fps

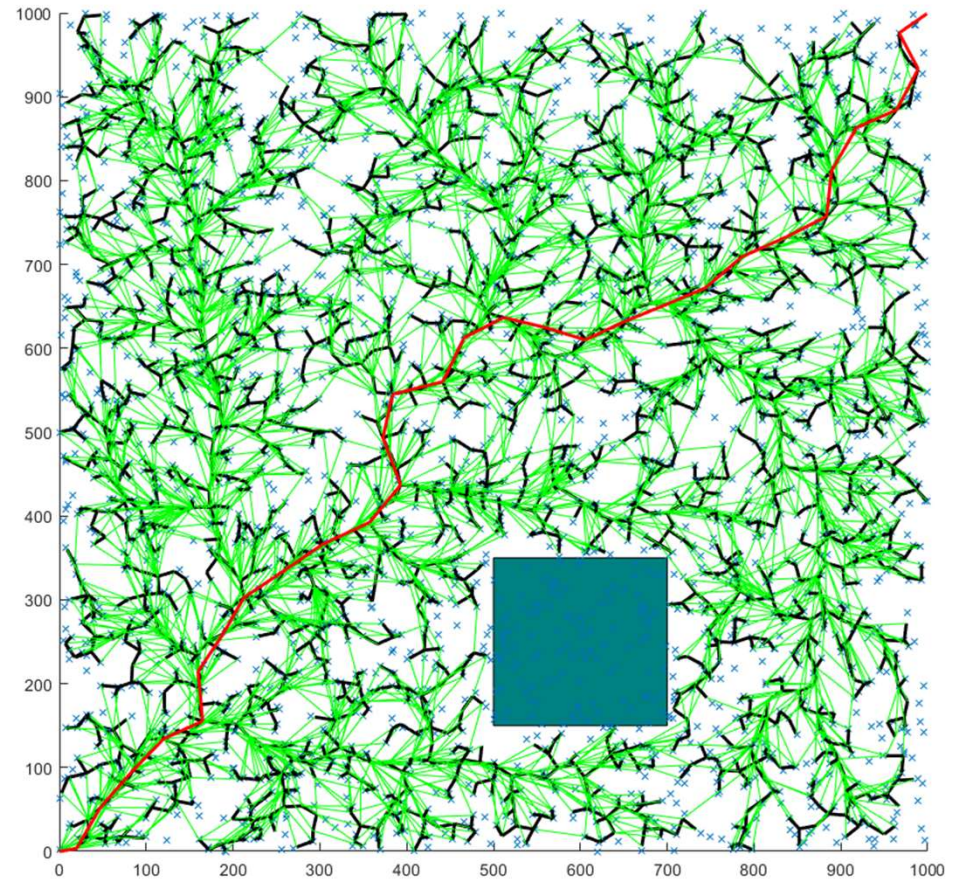




# RRT\* algorithm

Rapidly exploring  
random tree

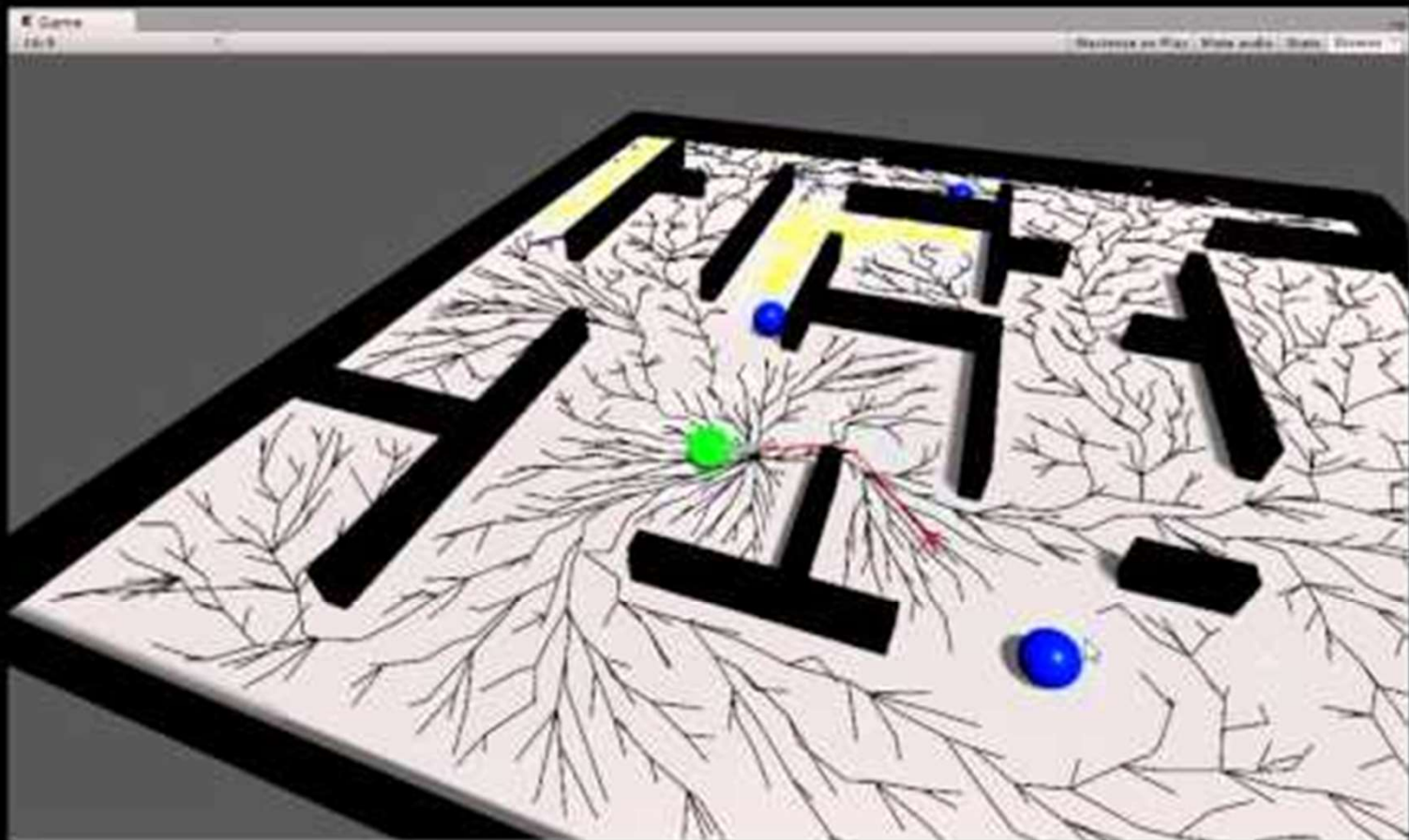
- Adaptation



## Some information

- Avoids obstacles, minimizes cost (length of path).
- Records the distance each vertex has traveled relative to its parent vertex.
- Rewiring of the tree.





## RRT\* informed algorithm

Rapidly exploring random tree

- More Adaptation!

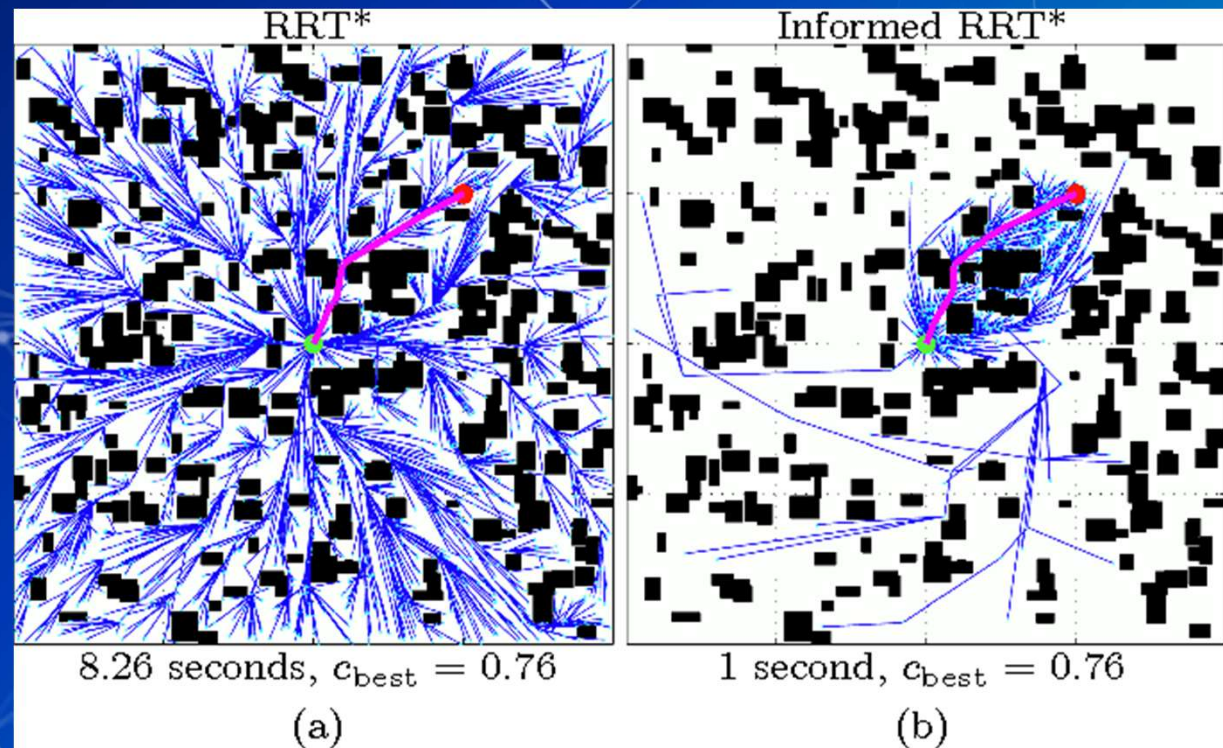


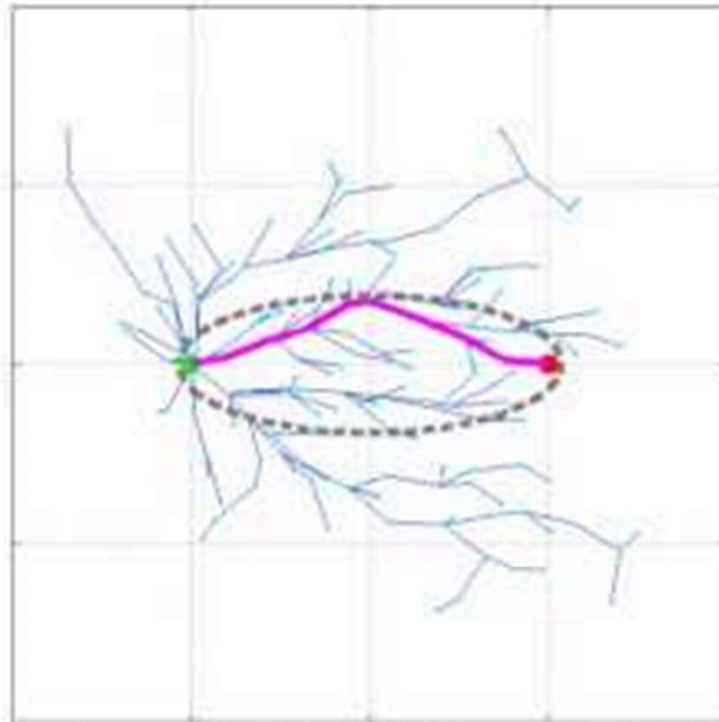
Fig. 1. Solutions of equivalent cost found by RRT\* and Informed RRT\* on



## Some information

- Avoids obstacles, minimizes cost (length of path).
- Records the distance each vertex has traveled relative to its parent vertex.
- Rewiring of the tree.
- Sampling of points after path is planned for cost reduction

000177



By *directly* sampling the ellipse, we focus the search to only the states that have the possibility of improving the solution.



■ What is path planning?

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- Dijkstra's algorithm

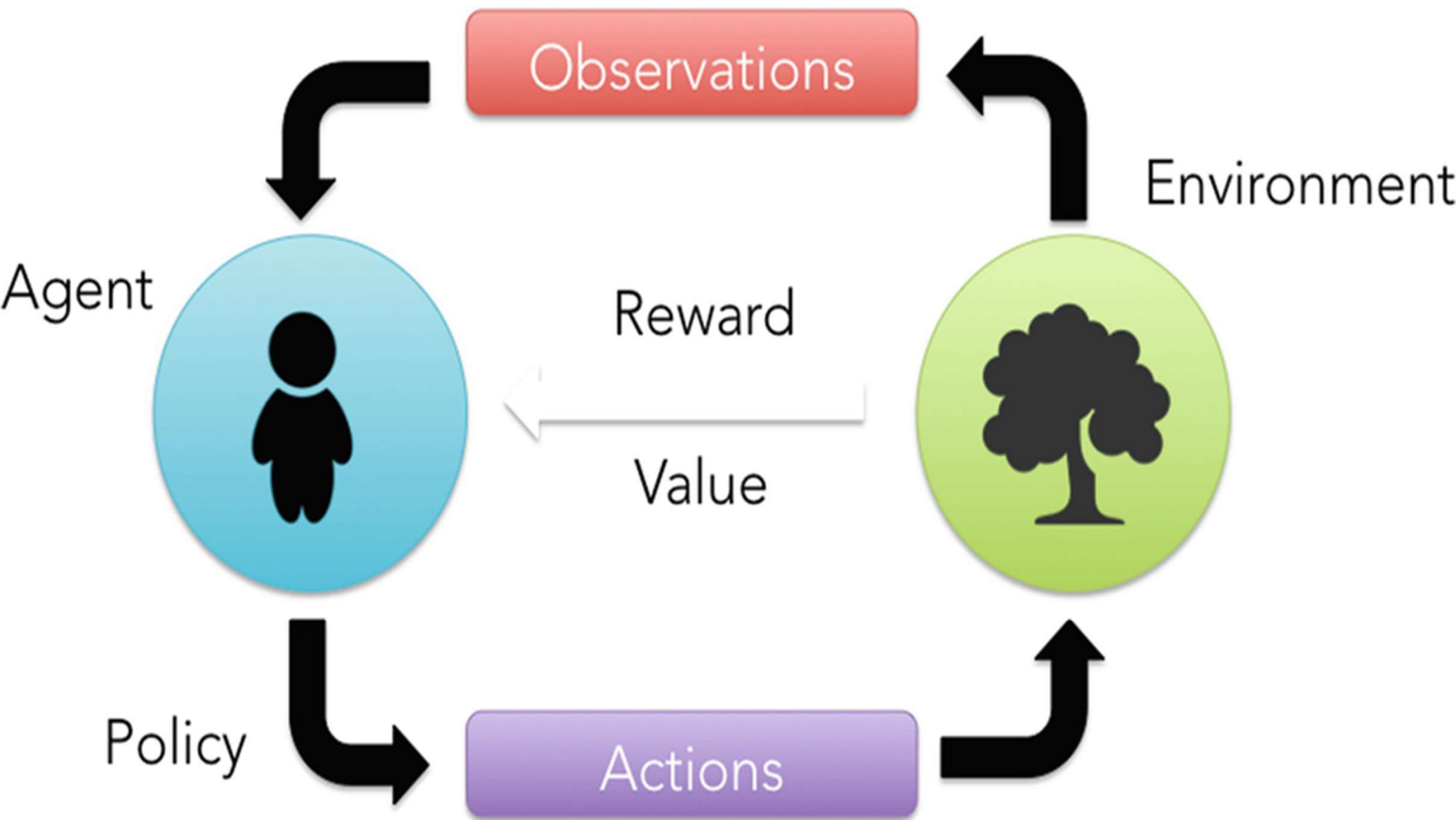
- A\* planning

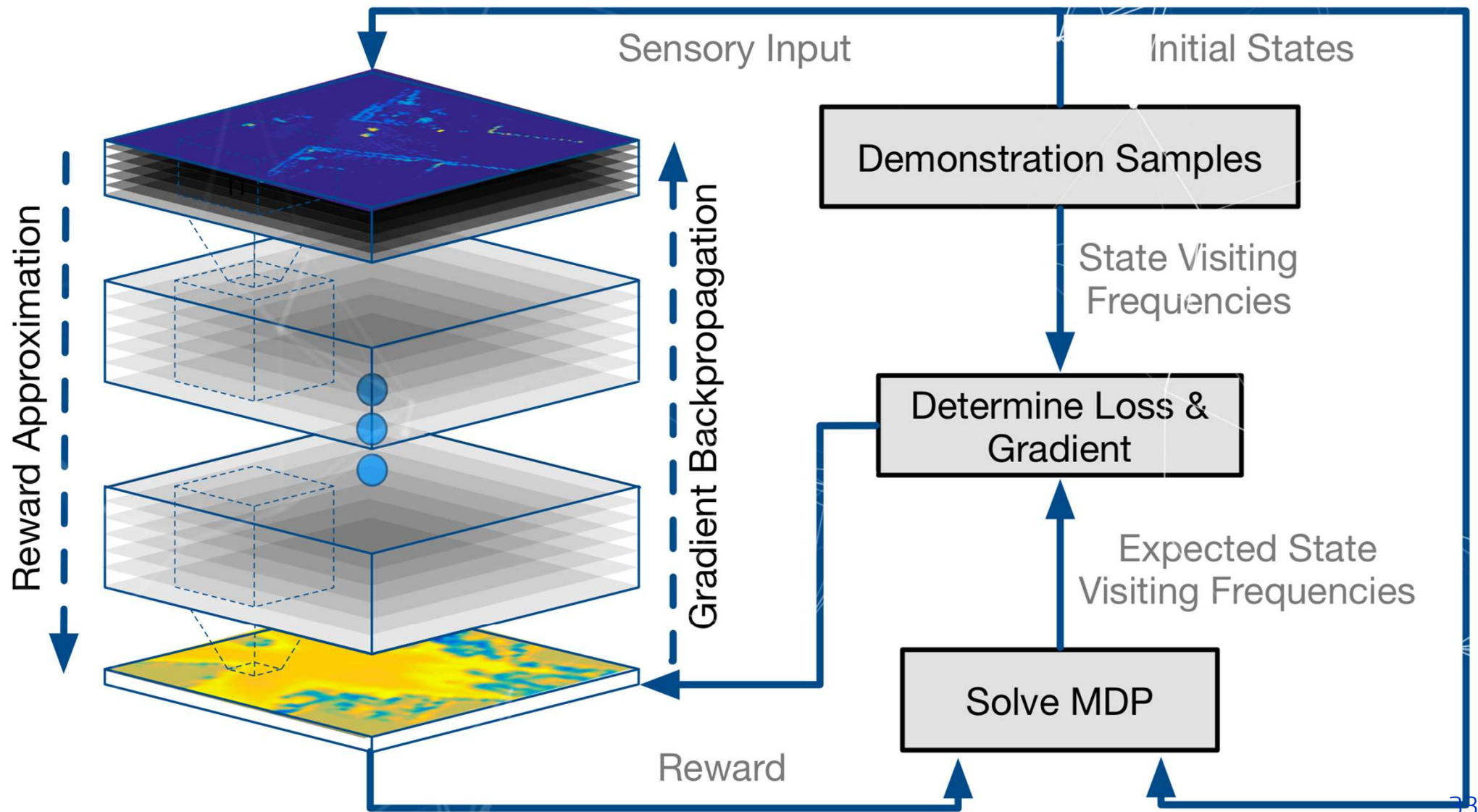
- Hybrid A\* planning

- RRT\* planning

- RRT\* informed planning

■ Using Deep Reinforcement learning







## Neural network activations



DNN Control

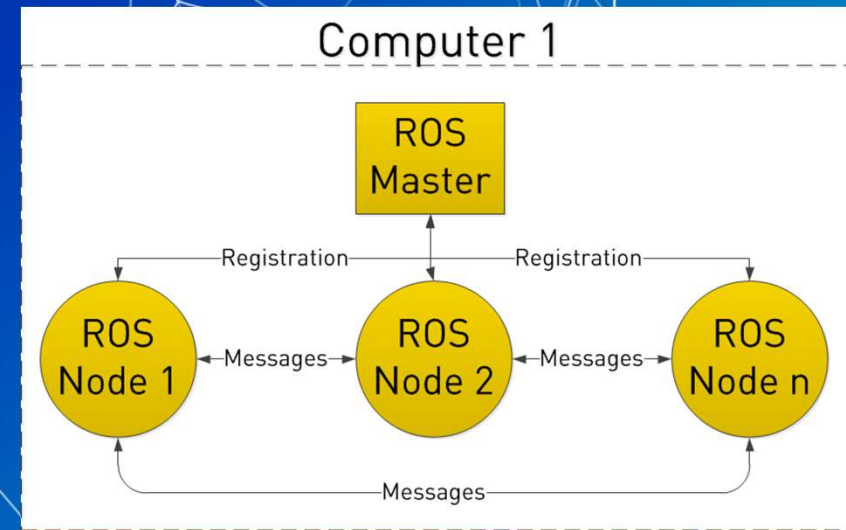


# ROS

## ROBOT OPERATING SYSTEM

# What is ROS? Why to use it?

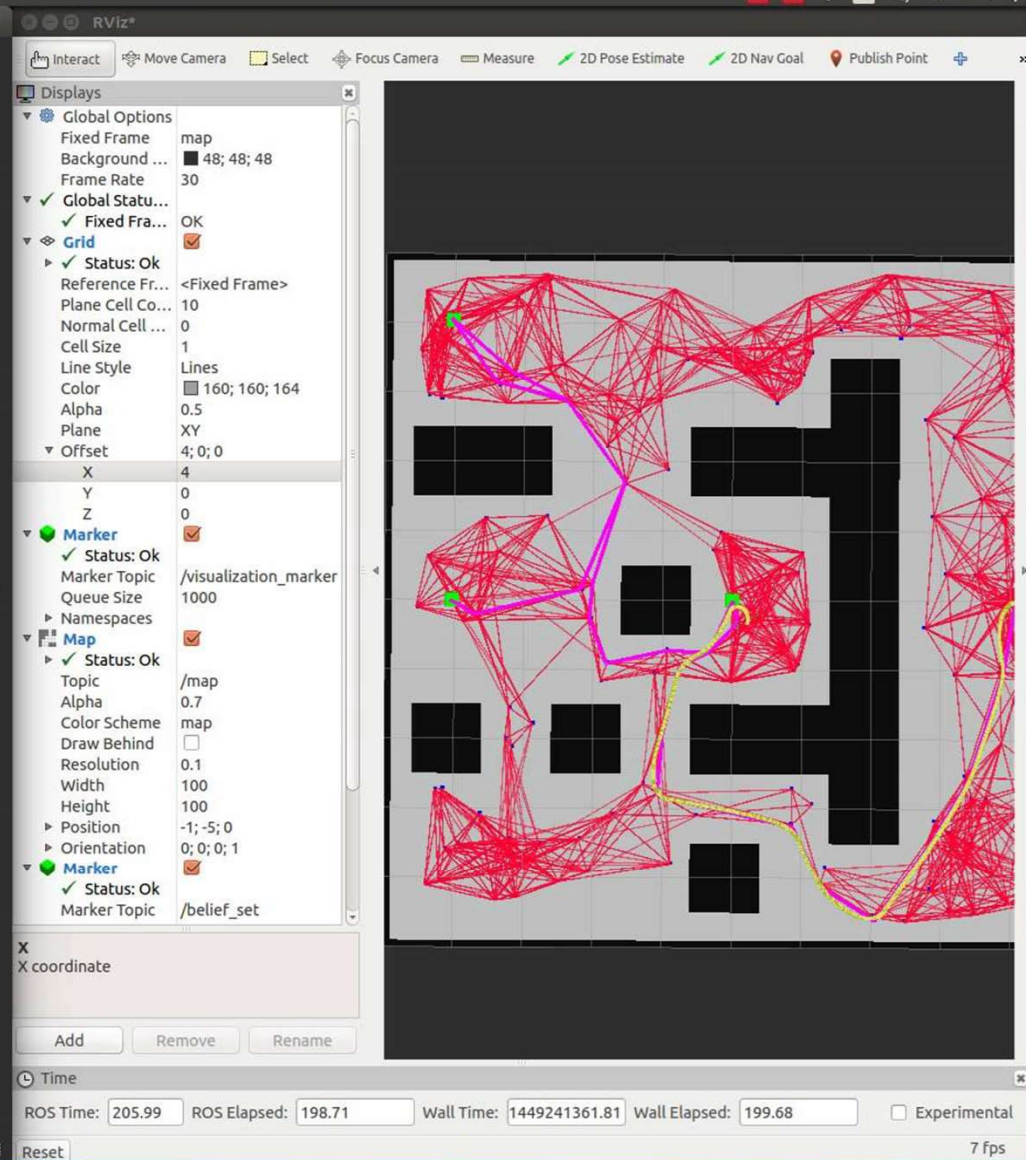
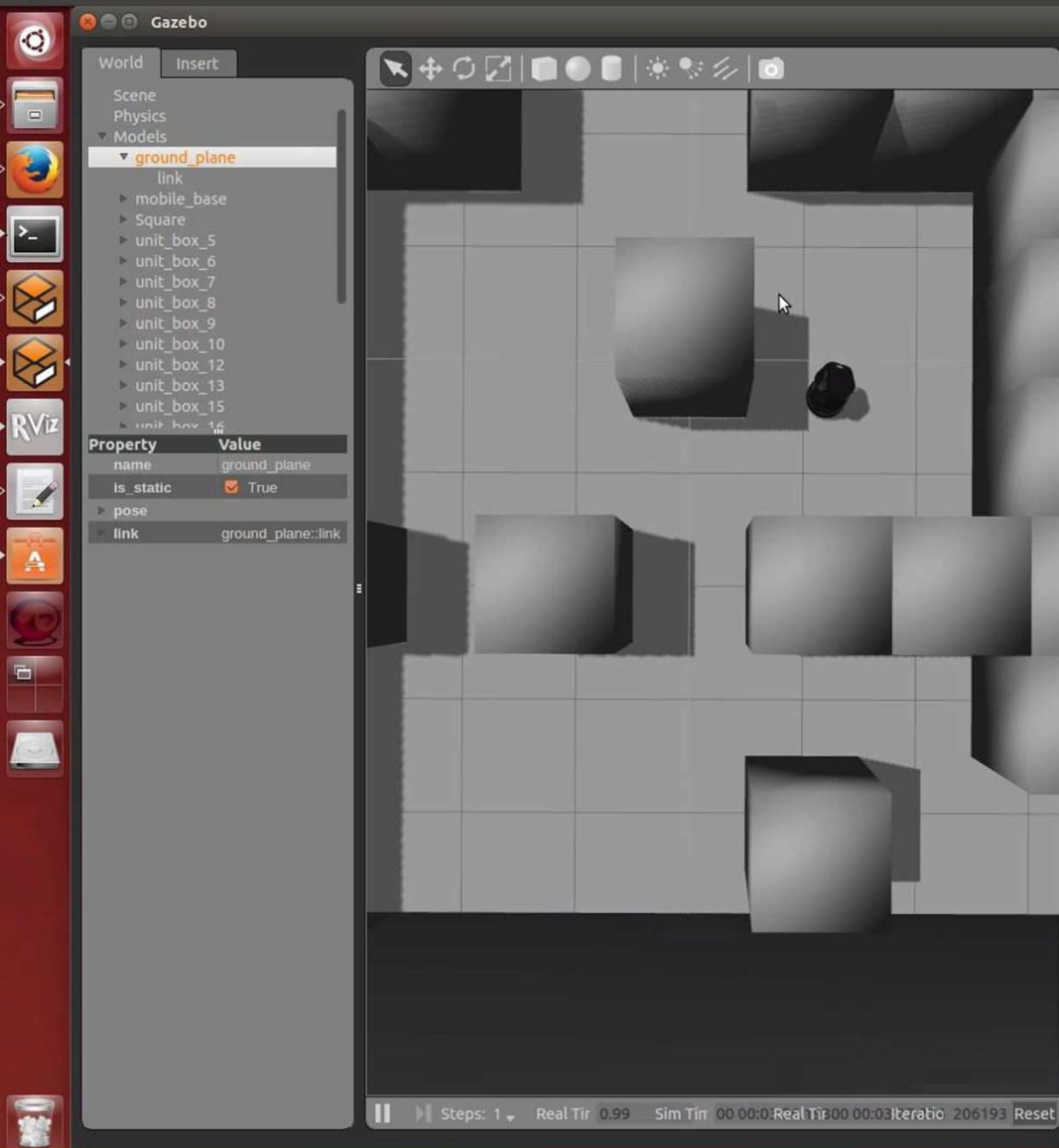
- Set of software libraries and tools to helps us build robot applications.
- Interface for communication
- A lot of reusability and possibilities of coworking



# What is ROS? Why to use it?

- Great tools for simulation and visualisation such as **Rviz** and **Gazebo**
- **Lots** of debugging tools
- Many packages already available on ROS platform
- Many useful pre-built libraries and routines
- No language boundaries







# Common terminologies

## Node

Processes that perform computation.

## Master

Provides name lookup and access to rest of the computational graph

## Message

Data structure which is output of a node

# Common terminologies

## Topics

Name used to identify the message handled out of the nodes

## Bags

Formats for saving and playing back ROS messages and data

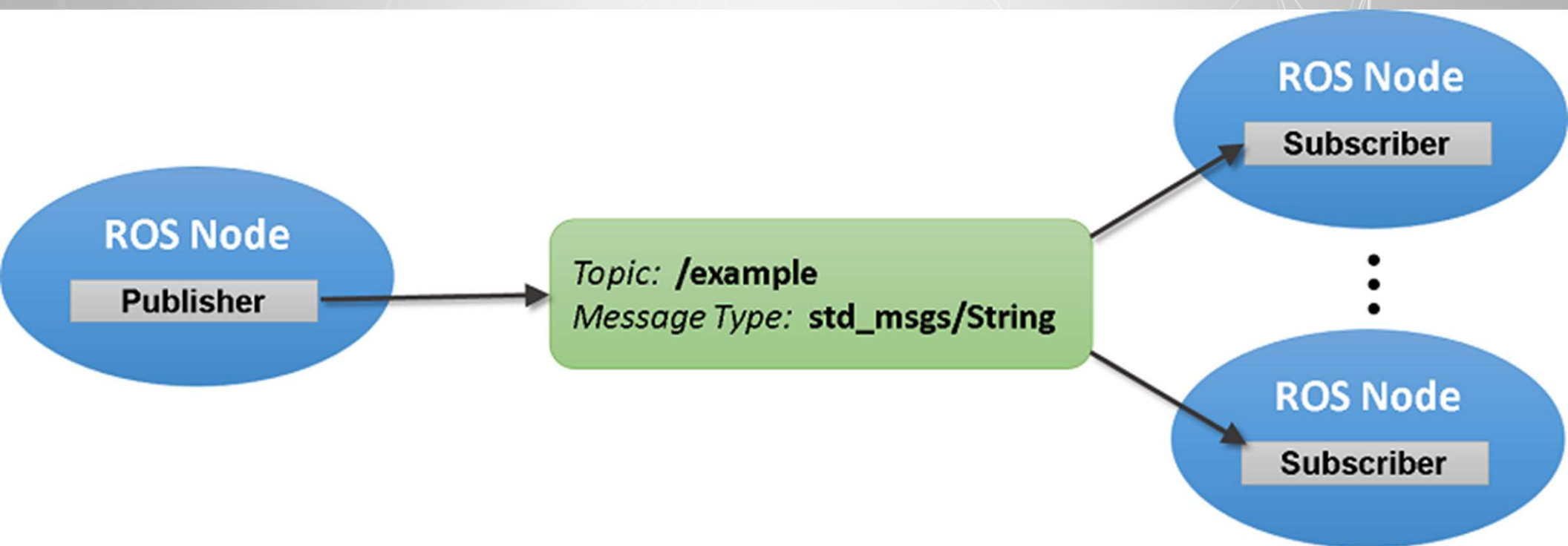
# Publisher and Subscriber

## **Publisher**

Used by node to publish data to ROS network on a particular topic

## **Subscriber**

Used by node to subscribe data from ROS network from a particular topic







# THANKS!

Any questions?



# CREDITS

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