

# Robot Motion Planning in Dynamic Environment: A Comparative Study

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June 25, 2019

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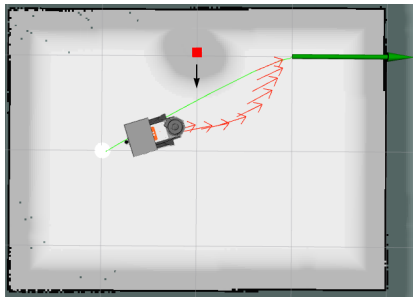
# Introduction I

## What is motion planning?

- A mobile robot needs to
  - Reach goal in **minimal** time
  - Avoid **static and moving** obstacle
  - Consider **kinematics and dynamic** constraints

## What is our aim?

Find out the “best” planner



**Figure:** Robot motion planning in dynamic environment

# Introduction II

What are the benefits?

- **Safer** environment for humans *and* for robots
- **Cost effective** transportation of goods

# State of the art I

## Survey of motion planning in dynamic environment (2018)<sup>4</sup>

- Covers 101 research papers published between 1985 and 2016
- Only introduces approaches.
- Contains almost no comparison.

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<sup>4</sup>M.G. Mohanan and Ambuja Salgoankar. "A survey of robotic motion planning in dynamic environments". In: *Robotics and Autonomous Systems* 100 (2018), pp. 171–185. ISSN: 0921-8890. DOI: <https://doi.org/10.1016/j.robot.2017.10.011>. URL: <http://www.sciencedirect.com/science/article/pii/S0921889017300313>.

# State of the art II

## Collision avoidance algorithm survey (2015)<sup>5</sup>

- Compares collision avoiding algorithms in detail.
- Does not validate the comparison with experiments.
- Mainly focuses on boundary following algorithms.

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<sup>5</sup>Michael Hoy, Alexey S. Matveev, and Andrey V. Savkin. "Algorithms for collision-free navigation of mobile robots in complex cluttered environments: a survey". In: *Robotica* 33.3 (2015), pp. 463–497. DOI: [10.1017/S0263574714000289](https://doi.org/10.1017/S0263574714000289).

# State of the art III

## Field contribution survey (2009)<sup>6</sup>

- Introduces 150 papers from 1986 to 2008. Compares contribution in different area of motion planning
- Only provides contributions of different fields. Does not compare the approaches at all.

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<sup>6</sup>Soheil Keshmiri and Shahram Payandeh. "An overview of mobile robotic agents motion planning in dynamic environments". In: *Proceedings of the 14th IASTED International Conference, Robotics and Applications (RA20)*, MA, Boston. 2009, pp. 152–159.

# State of the art IV

## Dated comparison (1992)<sup>7</sup>

- Surveys papers from 1979 to 1989 for all types of motion planning.
- Compares time and complexity
- Significantly old
- Does not compare with common parameters.

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<sup>7</sup>Yong K Hwang and Narendra Ahuja. "Gross motion planning—a survey". In: *ACM Computing Surveys (CSUR)* 24.3 (1992), pp. 219–291.

# What is lacking?

## Surveys

The surveys do not test the approaches.

## Individual published approaches

The individual published approaches test themselves

- on different robots<sup>8</sup>
- with different kinodynamic constraints<sup>8</sup>
- with different assumptions
- in different environments
- to optimize different parameters<sup>8</sup>

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<sup>8</sup>Michael Hoy; Alexey S. Matveev and Andrey V. Savkin;  
“Algorithms for collision-free navigation of mobile robots in complex cluttered environments: a survey”;  
In: Robotica 33.3 (2015); pp. 463 497. doi: 10.1017/S0263574714000289..



# Qualitative Comparison

We qualitatively compare 30+ planners based on

## Vehicle type

Holonomic, unicycle or bicycle

## Restrictions on obstacle

- Constant or varying direction
- Constant or varying velocity

## Obstacle shape

Circular or polygonal

## Experiment environment

Simulated and/or real

# Experimental setup

## Setup

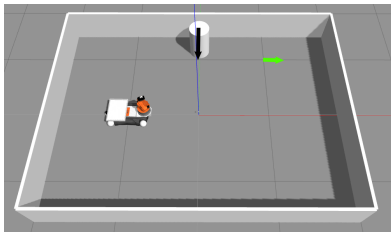
- **Robot:** KUKA youBot with 2 laser rangefinders
- **Environment:** Gazebo simulator
- **Obstacle:** Cylinders with varying velocity and varying direction
- **Optimisation parameter:** Minimise time

## Measured values

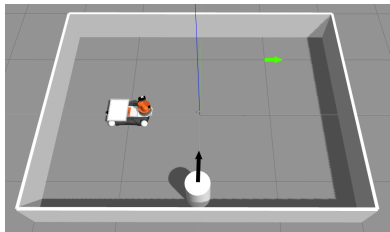
- Travel time
- Number of collisions
- Number of re-plans



# Test case 1 (Single room single obstacle)



(a)  $t=0.0s$

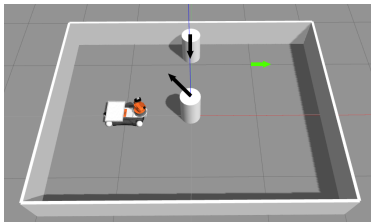


(b)  $t=10.0s$

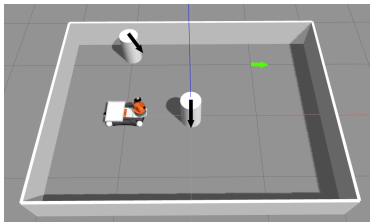
## Description

- Room size: 4 meters x 3 meters
- Starting position:  $x=-1.0$ ,  $y=0.0$ ,  $\theta=0.0$
- Goal position:  $x=1.0$ ,  $y=1.0$ ,  $\theta=0.0$

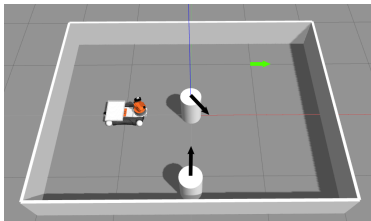
# Test case 2 (Single room two obstacles)



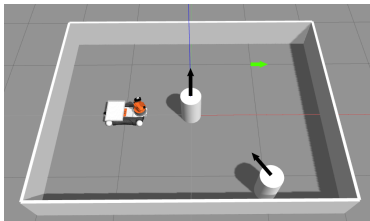
(a)  $t=0.0s$



(b)  $t=5.0s$

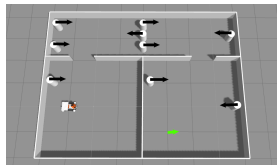


(c)  $t=10.0s$

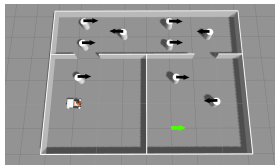


(d)  $t=15.0s$

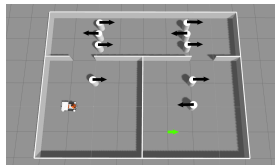
# Test case 3 (Double room nine obstacles)



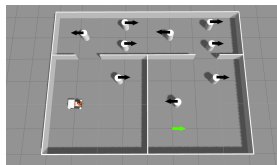
(a)  $t=0.0s$



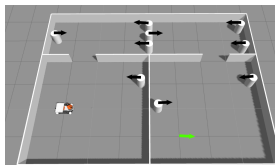
(b)  $t=5.0s$



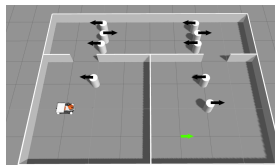
(c)  $t=7.5s$



(d)  $t=10.0s$



(e)  $t=15.0s$



(f)  $t=22.5s$

Figure: Test case 3 (Total size: 8m x 6m)

# Compared Planners

- Timed elastic band planner (TEB)<sup>9</sup>
- Spline based planner<sup>10</sup>.
- Elastic band approach (EBand)<sup>11</sup>.
- Eband\* (EBand2)
- Dynamic window approach\* (DWA)<sup>12</sup>

\* with obstacle position look ahead of 3 seconds

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<sup>9</sup>Christoph Rosmann, Frank Hoffmann, and Torsten Bertram. "Planning of multiple robot trajectories in distinctive topologies". In: *European Conference on Mobile Robots (ECMR)*. 2015, pp. 1–6.

<sup>10</sup>Tim Mercy, Ruben Van Parys, and Goele Pipeleers. "Spline-based motion planning for autonomous guided vehicles in a dynamic environment". In: *IEEE Transactions on Control Systems Technology* (2017).

<sup>11</sup>Sean Quinlan and Oussama Khatib. "Elastic bands: Connecting path planning and control". In: *IEEE International Conference on Robotics and Automation*. 1993, pp. 802–807.

<sup>12</sup>Dieter Fox, Wolfram Burgard, and Sebastian Thrun. "The dynamic window approach to collision avoidance". In: *IEEE Robotics & Automation Magazine* 4.1 (1997), pp. 23–33.

# Results I (Travel time)

Planner	Static single room	Test case 1	Test case 2	Static double room	Test case 3
TEB	<b>5.205</b>	5.972	6.083	<b>27.139</b>	<b>35.330</b>
Spline	5.421	<b>5.574</b>	<b>5.819</b>	-	-
DWA	19.526	17.625	17.114	39.004	-
EBand	6.270	6.570	6.240	30.862	71.968
EBand2	6.270	6.025	6.234	30.862	-

Table: Average time of travel for planners for different test cases

# Results II (Re-plans)

Planner	Static single room	Test case 1	Test case 2	Static double room	Test case 3
TEB	0	0	1	0	4
Spline	0	0	0	Fail	Fail
DWA	0	0	2	0	Fail
EBand	0	1	Fail	0	Fail
EBand2	0	1	1	0	Fail

Table: Maximum re-plan attempts of planners for different test cases

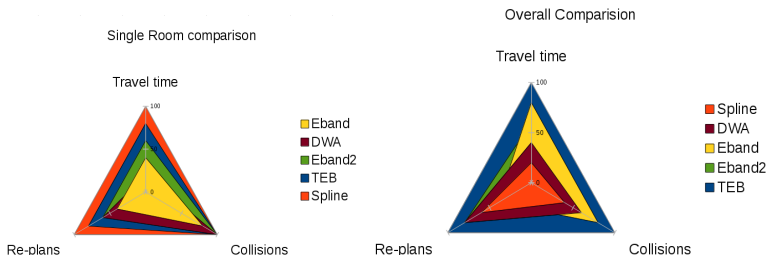


# Results (collisions)

Planner	Static single room	Test case 1	Test case 2	Static double room	Test case 3
TEB	0	0	0	0	0.75
Spline	0	0	0	-	-
DWA	0	0	0	0	-
EBand	0	0.25	0.5	0	4
EBand2	0	0	0	0	-

Table: Average collisions of planners for different test cases

# Results visualised



(a) Ranking comparison for test case 1 and 2

(b) Ranking comparison for all test cases

## Verdict

TEB planner performs best for our experiments out of 5 planners.

# Conclusion and future work

## Conclusion

- Qualitative comparison
- Develop an open source software to help test
- Test cases and framework for objective comparison
- TEB planner performs “best” for given scenarios

## Future work

- Test more planners on these test cases.
- Test with humans as obstacles for real robots.
- Test with different models of robots.

# References I



Fox, Dieter, Wolfram Burgard, and Sebastian Thrun. "The dynamic window approach to collision avoidance". In: *IEEE Robotics & Automation Magazine* 4.1 (1997), pp. 23–33.



Hoy, Michael, Alexey S. Matveev, and Andrey V. Savkin. "Algorithms for collision-free navigation of mobile robots in complex cluttered environments: a survey". In: *Robotica* 33.3 (2015), pp. 463 –497. DOI: 10.1017/S0263574714000289.



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# References II



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Quinlan, Sean and Oussama Khatib. "Elastic bands: Connecting path planning and control". In: *IEEE International Conference on Robotics and Automation*. 1993, pp. 802–807.



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