

# Reachability Analysis to perform robotic missions safely

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Avec le soutien de



**AGENCE  
INNOVATION  
DÉFENSE**

# Summary

- 1 Introduction
- 2 Reachability Analysis
- 3 Use cases
- 4 Conclusion

# Introductive Problem



Figure: Helios

# Introductory Problem

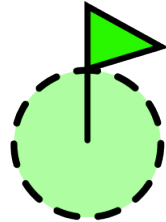
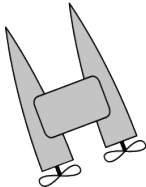


Figure: Base Situation

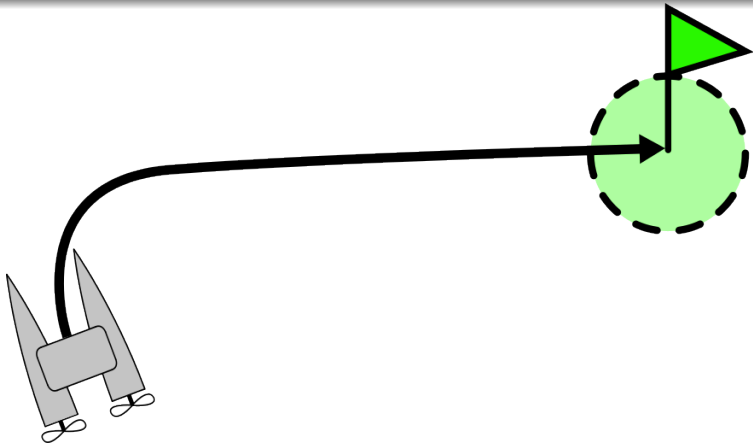


Figure: Perfect Case

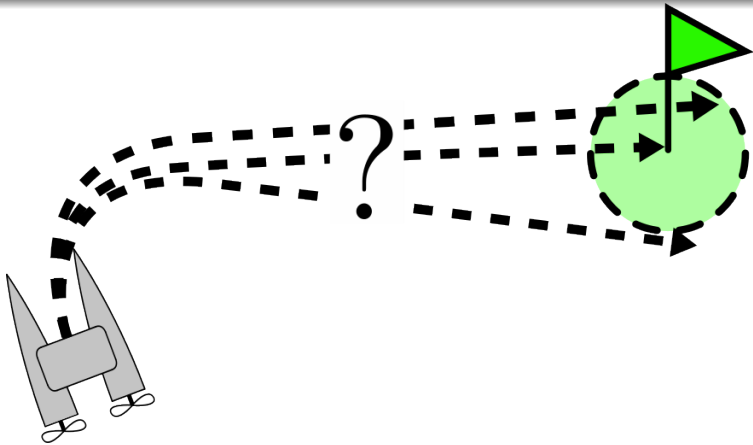


Figure: Perturbed Case

How can I compute the possible states of my robot ?

# Definition

Robot state :  $x$

State Equation :  $\dot{x} = f(x, u)$

$u \in \mathbb{U}$  : disturbance : inputs (motors) and perturbations (wind)

Definition (Reachable set at a point in time)

The Reachable Set at a given time  $t_r$  noted  $\mathcal{R}(t_r)$  is defined by :

$$\mathcal{R}(t_r) = \left\{ y \mid y = \int_0^{t_r} f(x(t), u(t)) dt \right\}$$

With  $x(0) \in \mathbb{X}_0$  the set of initial state and  $u[0, t_r] \in \mathbb{U}$  the disturbance set



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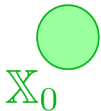
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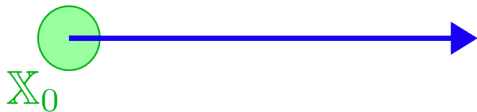
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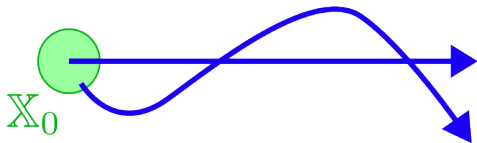
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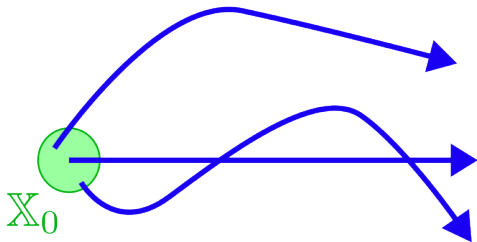
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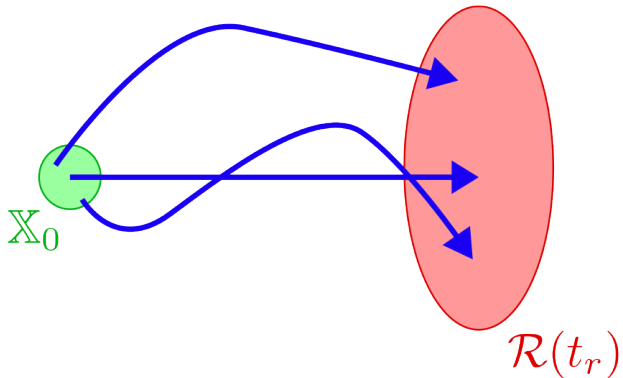
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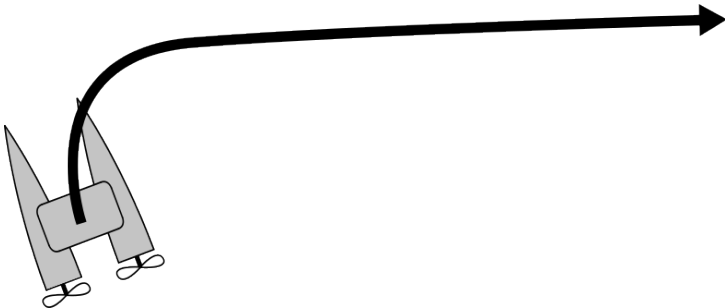


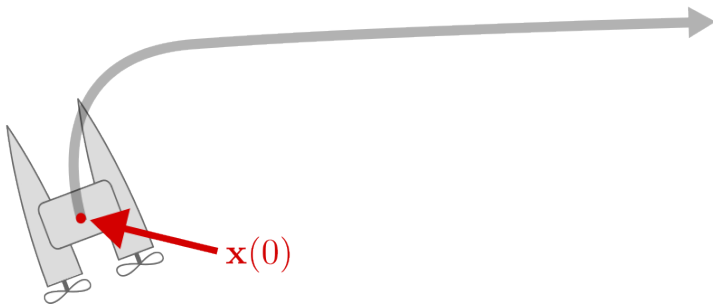


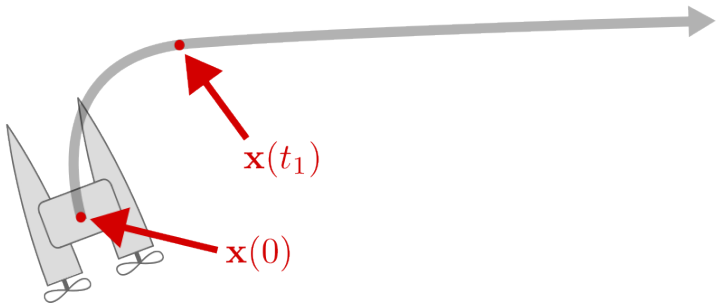


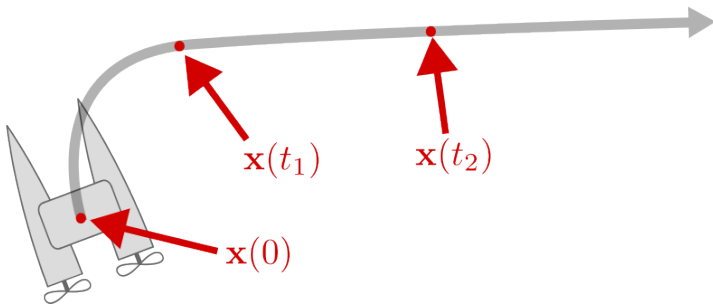


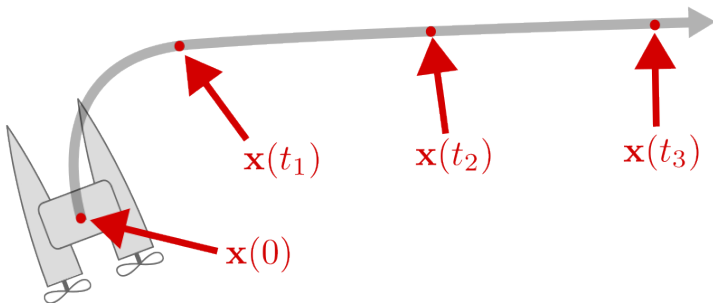
# Representations



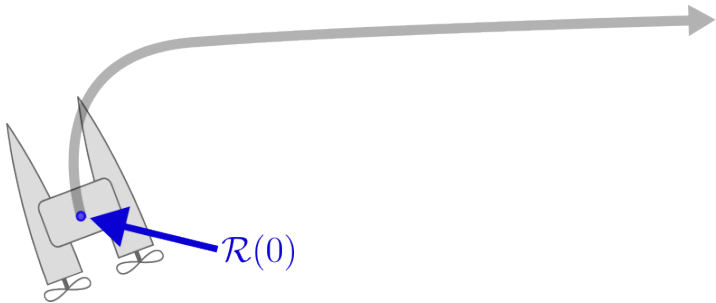


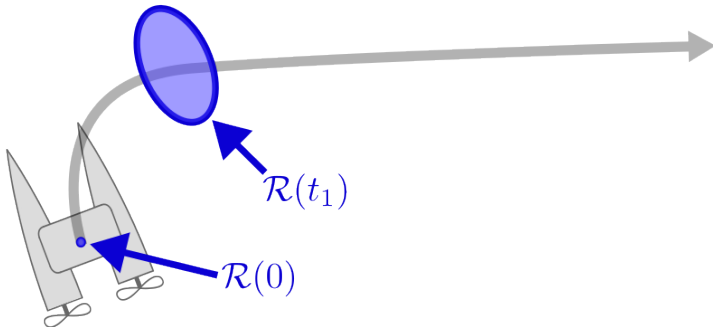


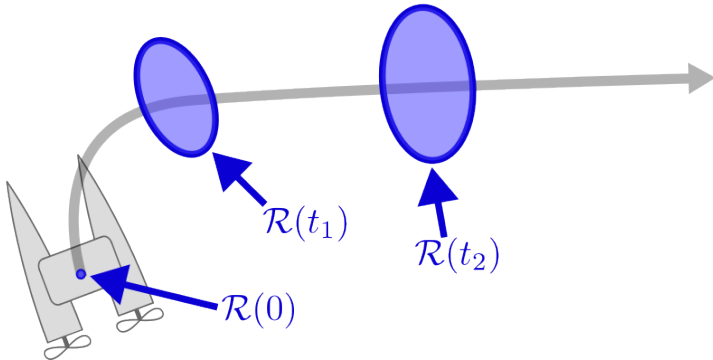




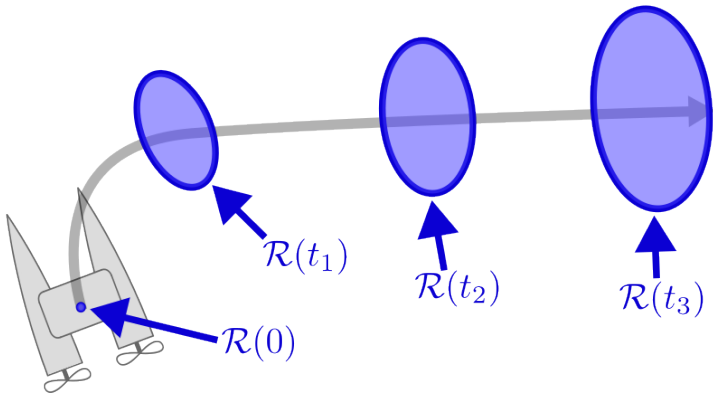
# Discrete representation







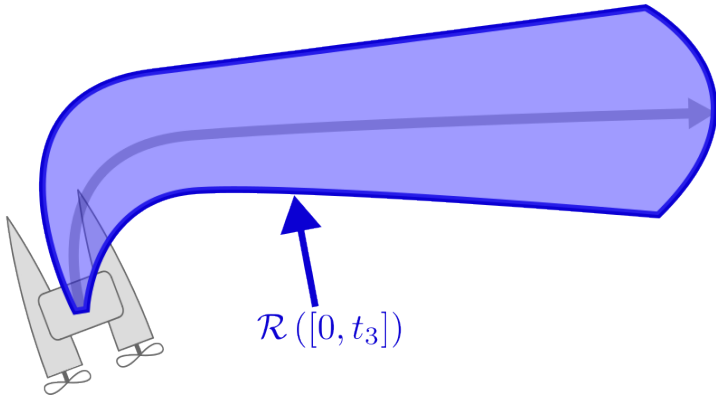




Can be obtained by a guaranteed integration of the State Equation:

- Lohner Algorithm (see [1])
- CAPD library

# Continuous representation



Can be obtained by using:

- Interval Analysis (codac library, see [2])

# Finite time : Reaching an area

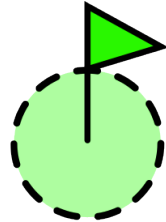
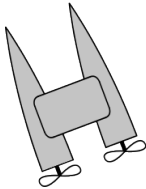


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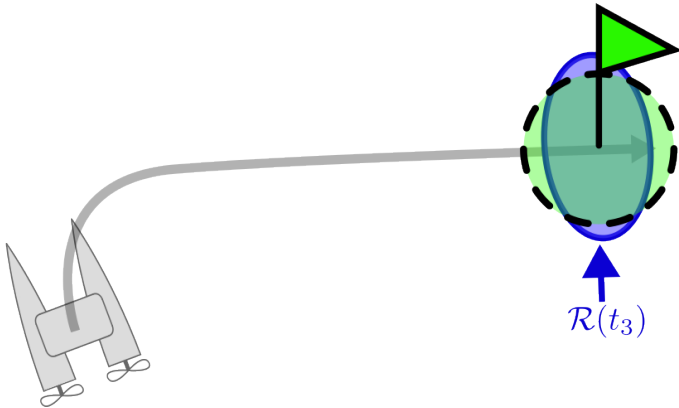


Figure: Unsafe Case

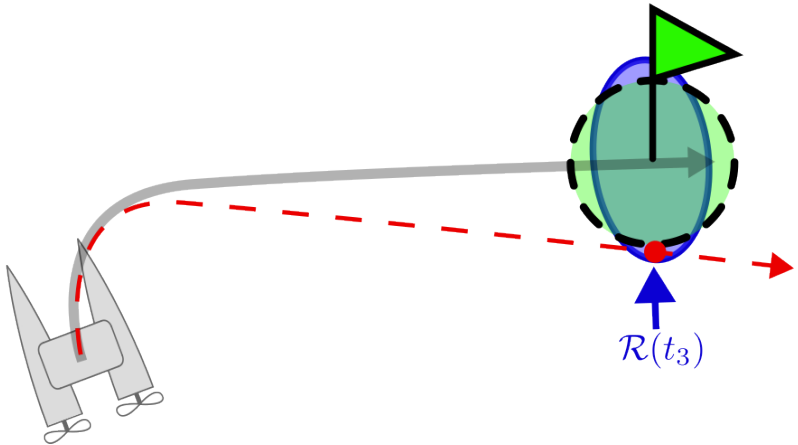


Figure: Unsafe Trajectory

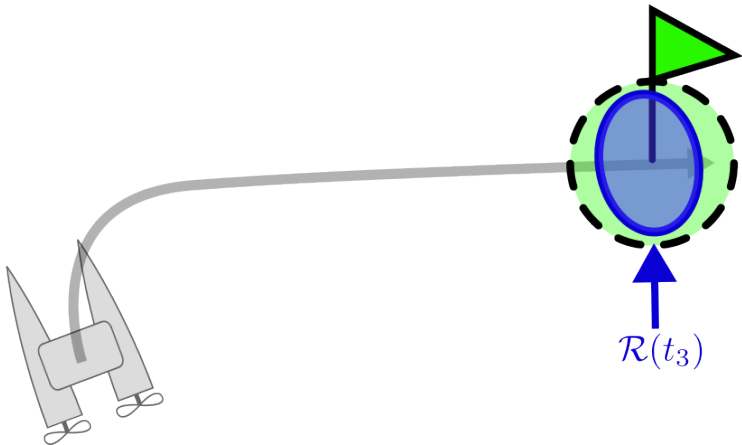


Figure: Safe Case



# Infinite time : Obstacle avoidance

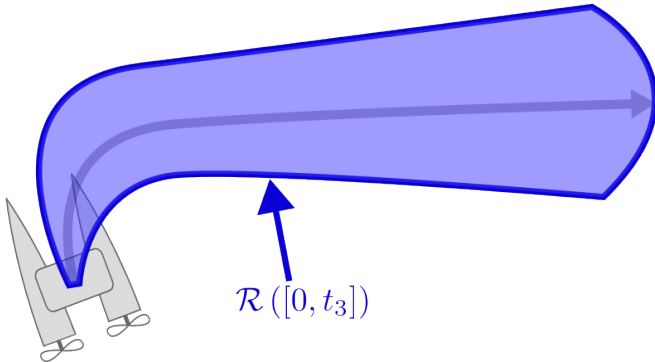


Figure: Continuous Representation

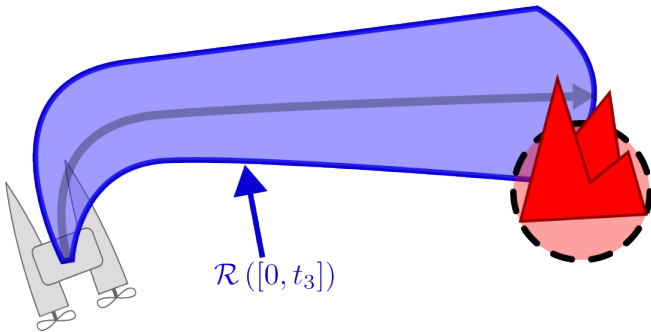


Figure: Unsafe Case

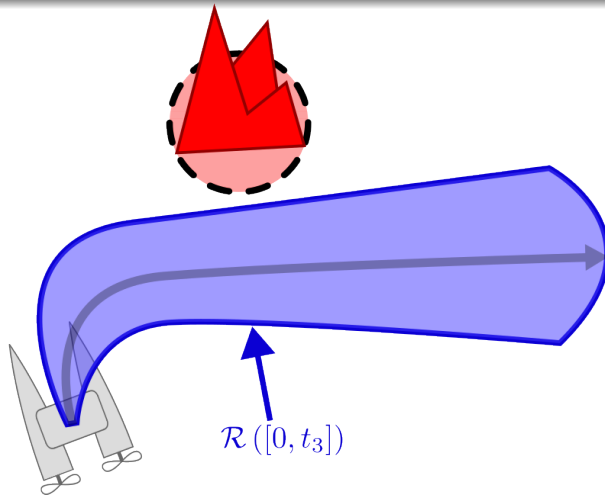


Figure: Safe Case

# Conclusion

- Ensuring robot safety
  - Discrete / Continuous representation
  - Different ways to estimate the Reachable Set (see References)

In my case Interval Analysis and optimal control

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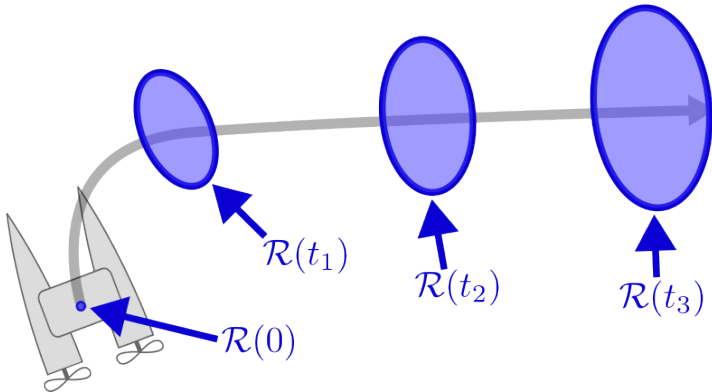
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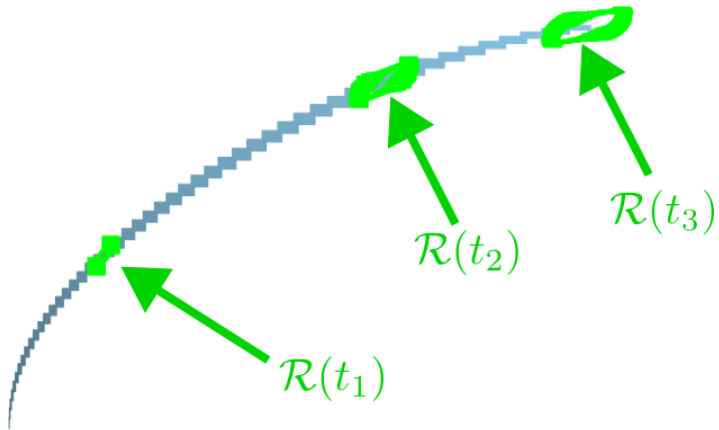
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Thank you for listening

## References

[1] Lohner R. J., Enclosing the solutions of ordinary initial and boundary value problems, *Computerarithmetic*, pp. 225–286, 1987.

[2] Rohou S., Jaulin L., Mihaylova L., Le Bars F, Veres S., Guaranteed computation of robot trajectories, *Robotics and Autonomous Systems*, Volume 93, 2017, Pages 76-84.

Lew T., Bonalli R., Pavone M., Exact Characterization of the Convex Hulls of Reachable Sets, *62nd IEEE Conference on Decision and Control (CDC 2023)*, Dec 2023, Singapour, Singapore.

Damers J., Jaulin L., Rohou S., Lie symmetries applied to interval integration, *Automatica*, Volume 14, 2022.