



Guaranteeing Safe Navigation in Dynamic Environments

*A Workshop of the IEEE Int. Conf. on Robotics and Automation
Friday May 7, 2010 – 9h00 to 12h30 in Egan Center Room 1*

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● Program

Motion Safety

Epilogue

Program

9h00-9h30: Guaranteeing Motion Safety in Dynamic Environments, an Introduction
Thierry Fraichard & James Kuffner

9h30-10h00: Optimal Reciprocal Collision Avoidance
Dr. Jur van den Berg, University of California, Berkeley (US)

10h00-10h30: Distributed Reactive Collision Avoidance
Dr. Emmett Lalish, University of Washington & Moiré Incorporated (US)

10h30-10h45: *Coffee Break*

10h45-11h15: The Nonlinear Velocity Obstacle Revisited: the Optimal Time Horizon
Prof. Zvi Shiller, Ariel University Center (IL)

11h15-11h45: Detecting if a Robot Trajectory is Guaranteed Continuously Collision-Free in Unknown and Unpredictable Environments
Prof. Jing Xiao, University of North Carolina, Charlotte (US)

11h45-12h15: Safety and Computational Efficiency Tradeoffs in Replanning with Sampling-based Planners
Prof. Kostas Bekris, University of Nevada, Reno (US)

12h15-12h30: Final discussion and conclusion



Guaranteeing Motion Safety in Dynamic Environments, an Introduction



Motivations

- Program

Motion Safety

- **Motivations**
- Motion Safety Criteria
- Compactor Scenario
- Motion Safety
- Literature Review
- ICS-Check + Avoid
- Deterministic World Model
- Probabilistic World Model

Epilogue

Now...



- Factory Robotics

Caged robots!



Motivations

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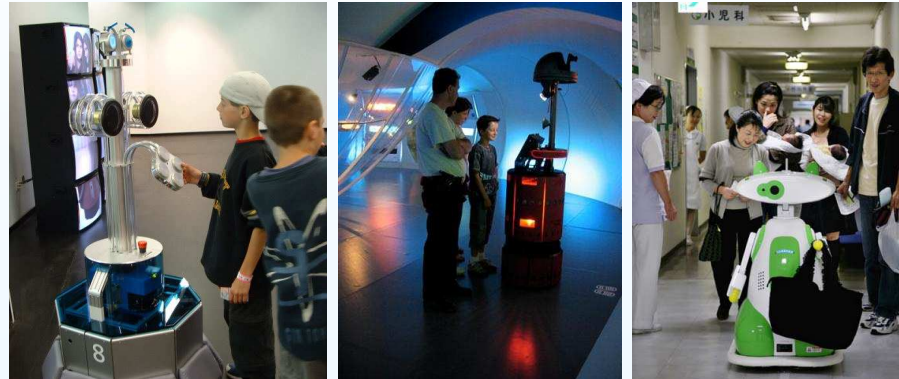
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In the future...



- Service/Personal Robotics
- Intelligent Transport Systems (ITS)

Robots and humans living together!



Safe Navigation? Hum... Not Yet

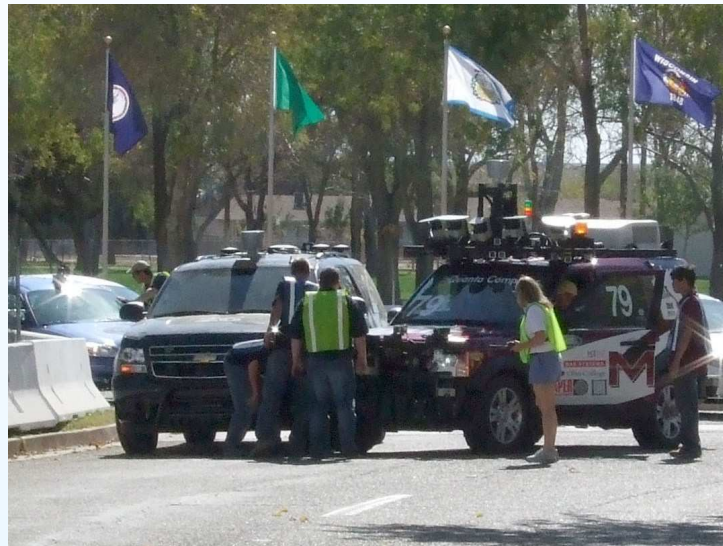
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DARPA Urban Challenge [Nov. 2007]



Robots are potentially dangerous \rightsquigarrow **Motion Safety** issue...



Moving Safely in Dynamic Environments

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Why do collisions occur?

1. Hardware failure
2. Software bugs
3. “Mis-understanding”
4. “**Mis-reasoning**”

Motion safety criteria for dynamic environments [*Fraichard 07*]:

- Key aspect: **time** {
1. Reasoning about the **future**
 2. Appropriate **lookahead**
 3. **Decision time** constraint



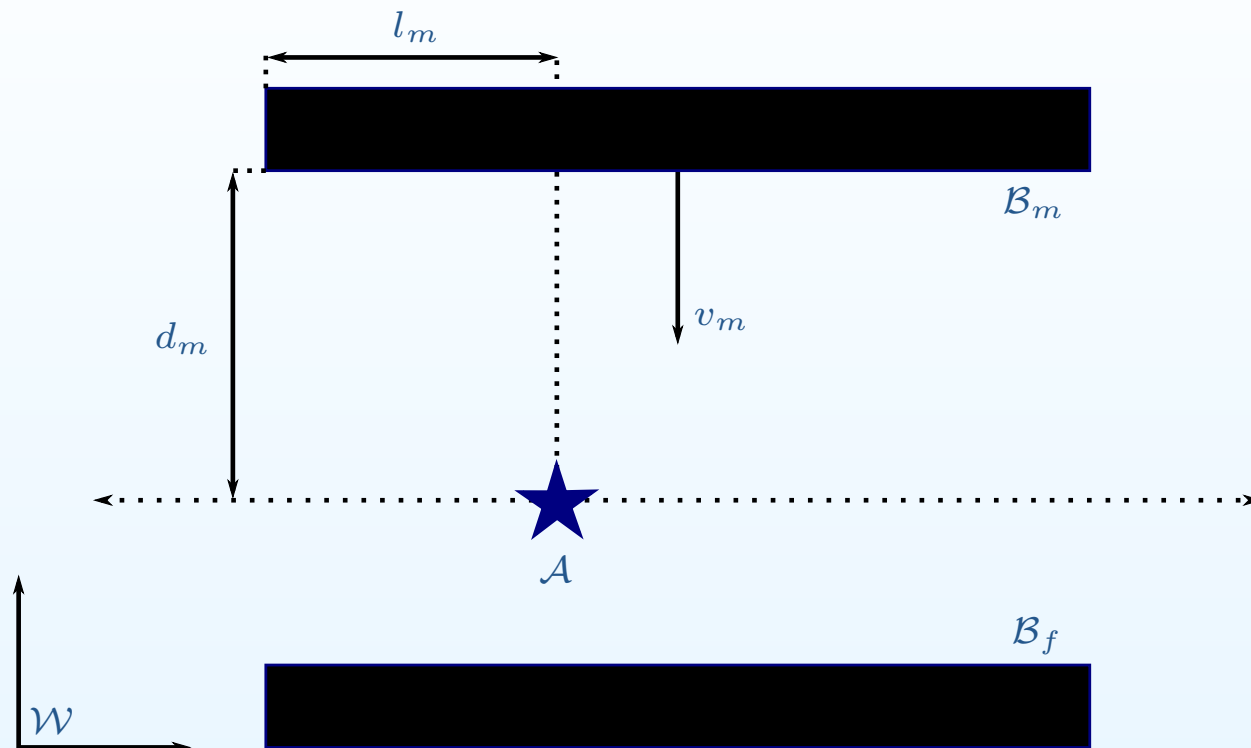
“Compactor” Scenario

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$$A : s = p \in [0, 1], u = v \in [-v_{\max}, v_{\max}], \dot{s} = u$$

Time to collision: $t_c = d_m / v_m$

\leadsto Collision condition: minimum time to escape $t_e = l_m / v_{\max} > t_c$



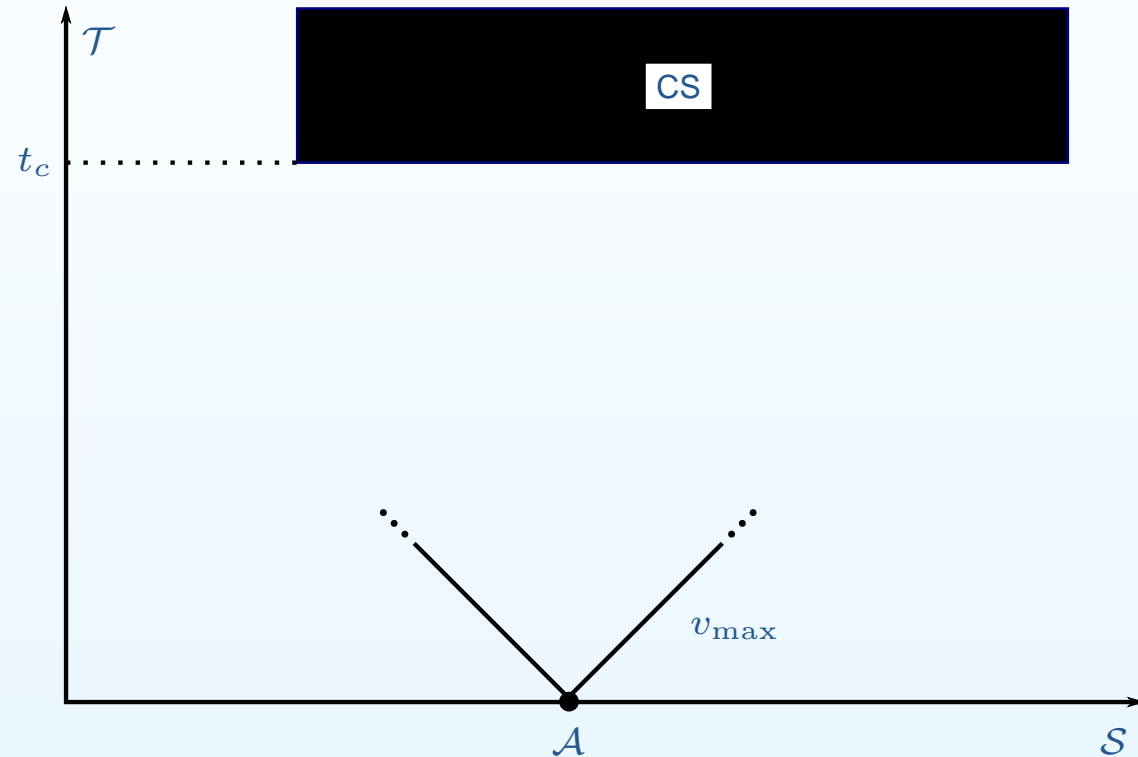
“Compactor” Scenario: Reasoning about the Future

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1. Reasoning about the future: Space \times Time reasoning

- Configuration \times Time space [Erdmann & Lozano-Perez 87]
- State \times Time Space [Fraichard 92]
- Future behaviour of the moving objects
- Robot's dynamics (reachable states)



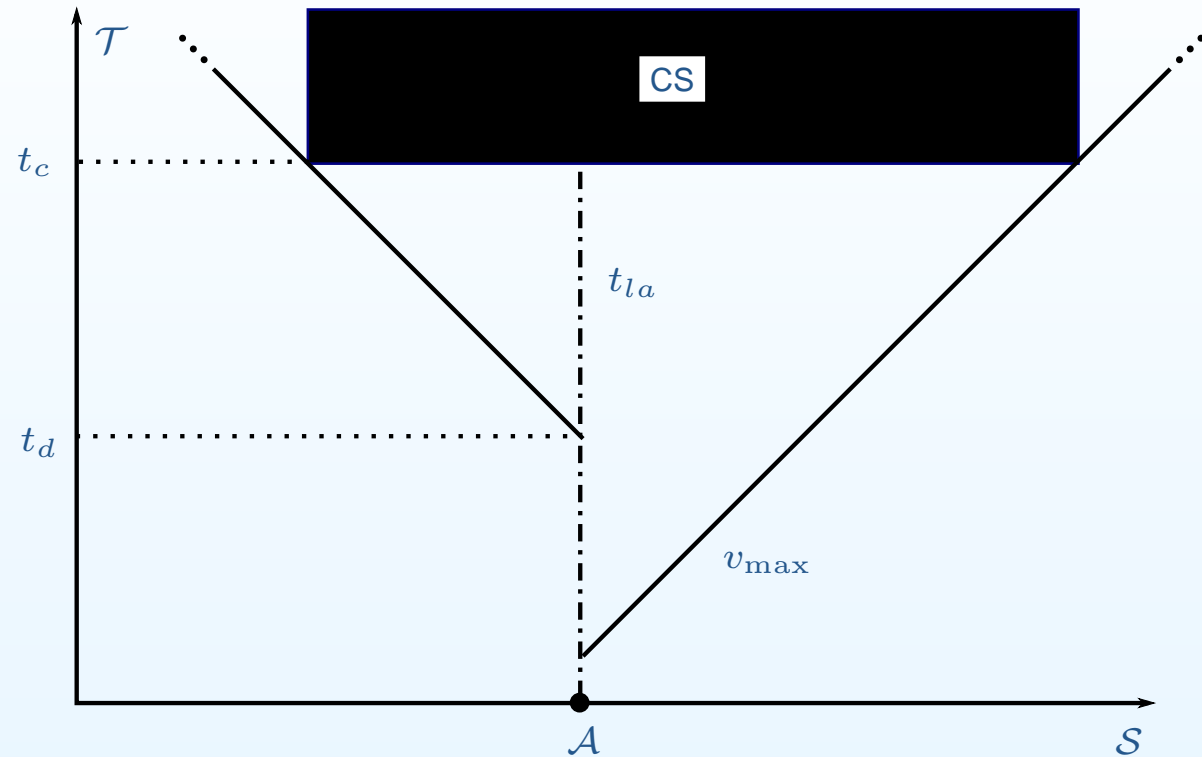
“Compactor” Scenario: Lookahead & Decision Time

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2. Appropriate lookahead $t_{la} > t_e$
 3. Decision time constraint $t_d < t_c - t_e$
- } $f(\text{environment})$

Key issue: t_{la} (resp. t_d) **arbitrarily** large (resp. small)

e.g. $v_m \rightarrow 0$ and $l_m \rightarrow \infty \Rightarrow t_{la} \rightarrow \infty$



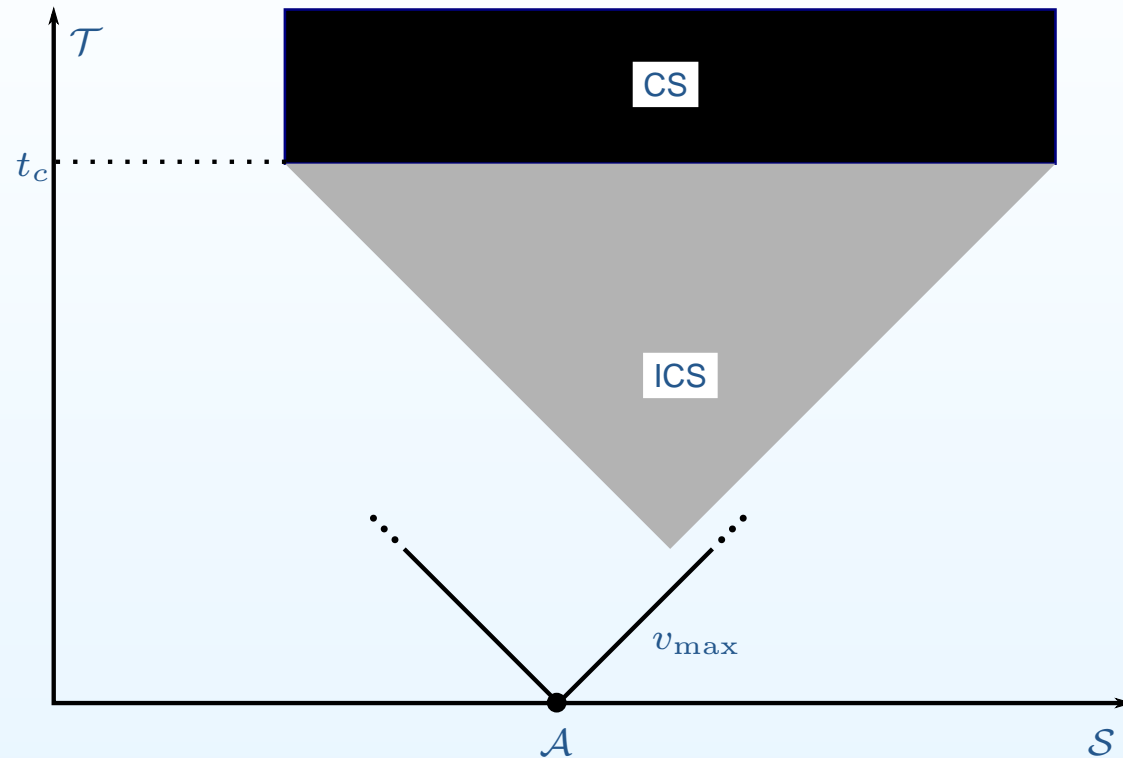
“Compactor” Scenario: Inevitable Collision States

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From Collision States to **Inevitable Collision States**: whatever the future trajectory followed by the robot, a collision eventually occurs [Fraichard 03]

Similar concepts: Obstacle Shadow [Reif & Sharir 85], Region of Inevitable Collision, [Lavelle & Kuffner 99], Viable Kernels [Aubin 91], Backward Reachable Sets [Mitchell & Tomlin 02]



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Key aspect: **time** {

1. Reasoning about the **future**
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The **Three Laws** of motion safety. . .

Q: how to guarantee **motion safety**, *i.e.* never ending up in a situation where a collision eventually occurs?

A: avoid **Inevitable Collision States**



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A Little Bit of History

World models used:

1. “Quasi-static” / “Frozen world” assumption: Potential Field [*Khatib 86*], Dynamic Window [*Fox et al 97*], Nearness Diagram [*Minguez & Montano 00*], Vector Field Histogram [*Ulrich & Borenstein 00*]
2. Reasoning about the future: Velocity Obstacle [*Fiorini & Shiller 98*], Dynamic Window++ [*Seder & Petrovic 07*], Urban Challenge 07
3. Lookahead issue remains largely untouched

Ways to “ensure” safety should a problem arise:

1. Reactivity:
... No problem, I can react fast
2. τ -safety:
... I take you there safely, then you have time τ to find a solution
3. Evasive trajectories:
... No problem, I have a backup plan

~> Guaranteed motion safety not there . . .



From ICS-Check to ICS-Avoid [Martinez & Fraichard 08-09]

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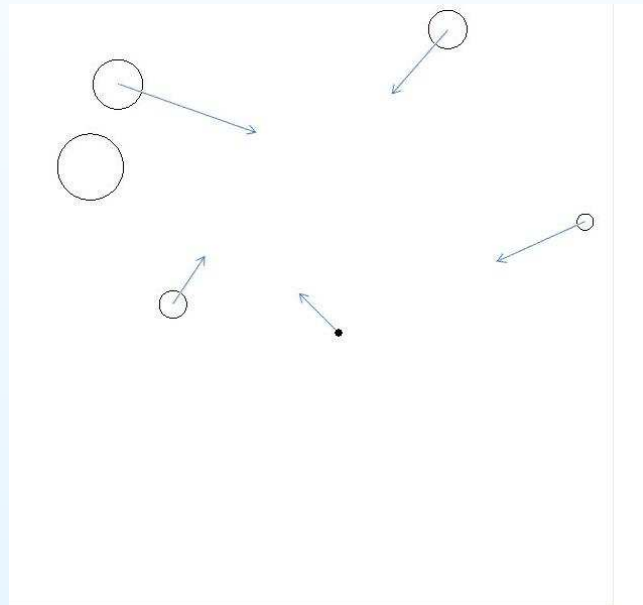
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Epilogue

ICS-Check: generic and efficient ICS-checker for planar robots

- Deterministic model of the future
- **Appropriate** lookahead



$$\text{Car-like robot: } s = (x, y, \theta, v, \xi); u = (\dot{v}, \dot{\xi})$$

ICS-Avoid: first provably safe collision avoidance scheme **but** wrt the model of the future used



First Assessment of the Situation

- Program

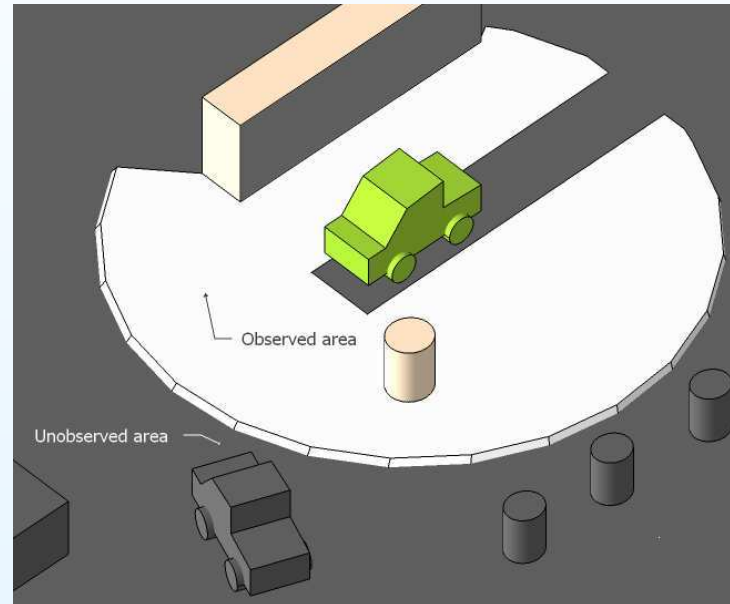
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Is ICS-based collision avoidance **the** answer to motion safety?

In theory, yes. One caveat though: omniscience required!



How to deal with incomplete information / uncertainty?



Deterministic Model

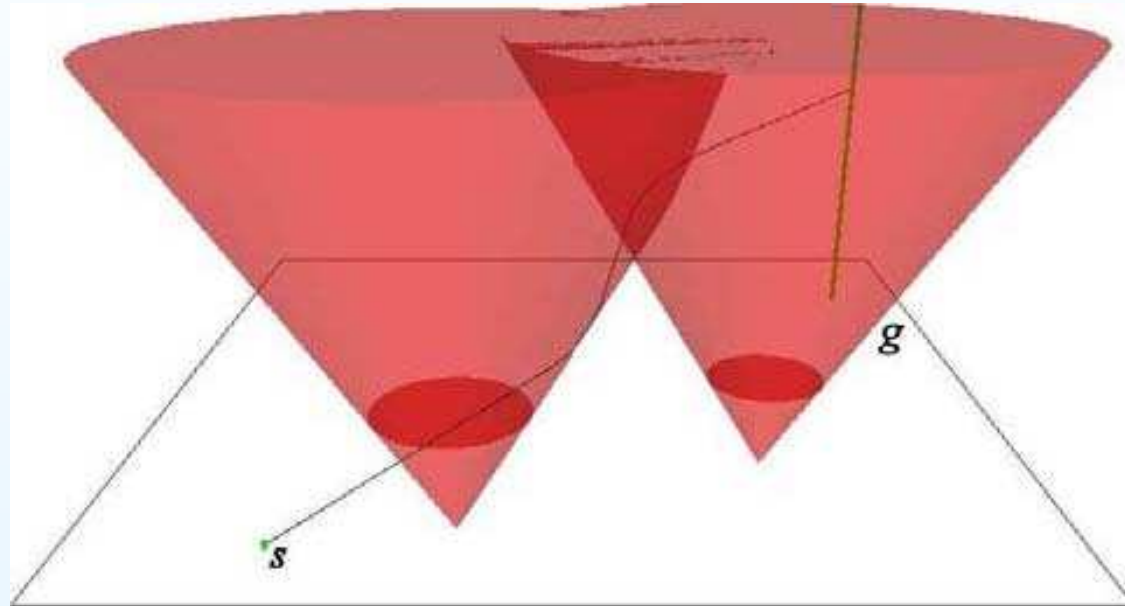
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Nominal motion \rightsquigarrow No safety



To be safe, be conservative [Van den Berg 07, Vatcha & Xiao 08]

Obstacles everywhere eventually \rightsquigarrow ICS everywhere...



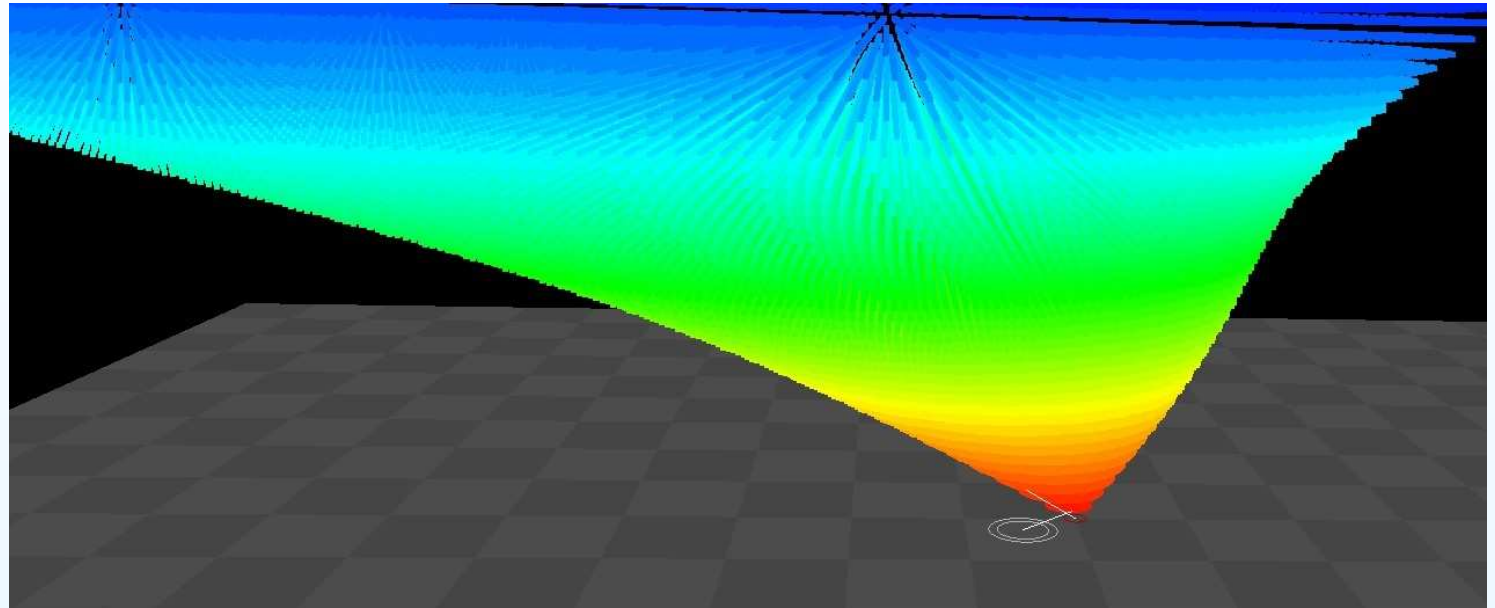
Probabilistic Model

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Obstacles vanish eventually \leadsto Lookahead [*Kushleyev & Likhachev 09*]

Uncertainty taken into account but ICS lost \leadsto Probabilistic ICS [*Althoff etal 10*;
Bautin & Fraichard 10]



- Program

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Epilogue

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Final Assessment of the Situation

Is absolute motion safety achievable in open & dynamic environments?

Maybe not. . .

Is probabilistic motion safety sufficient?

Maybe not. . .

What can be done then?

Weaker levels of motion safety, e.g. “Passive Safety”, “Friendly Passive Safety”
[Macek & Fraichard 08]



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