

A Geometric Approach to the Coverage Measure of the Area Explored by a Robot

Certified and Symbolic-Numeric Computation Workshop

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- ① Introduction
- ② Problem Statement
- ③ Problem Approach
- ④ Sweeping backwards
- ⑤ Experiment
- ⑥ Conclusions



① Introduction

② Problem Statement

③ Problem Approach

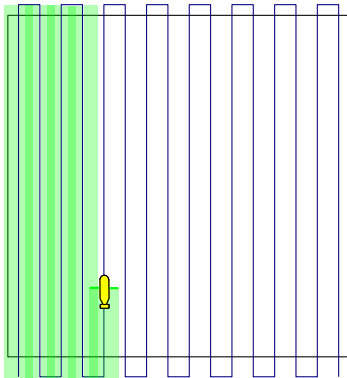
④ Sweeping backwards

⑤ Experiment

⑥ Conclusions



Case of Study

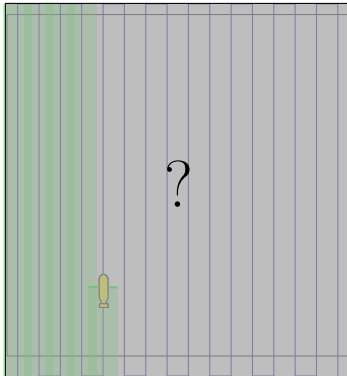


Context

- Unknown environment,
- area covering mission,
- revisiting,
- region avoidance,
- line-sweep exploration.



Case of Study



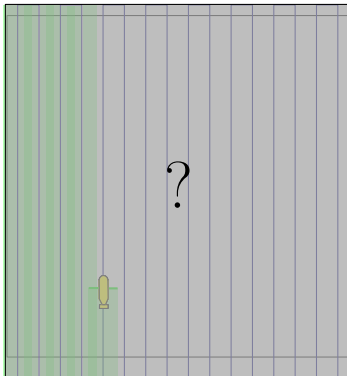
Objectives

Using only proprioceptive data, to estimate:

- Explored area
- Number of views (coverage measure)



Case of Study



Applications:

- Assess area-covering missions,
- plan other missions to fill possible gaps,
- assess revisiting missions,
- optimal trajectory planning,
- localization in homogeneous environments.



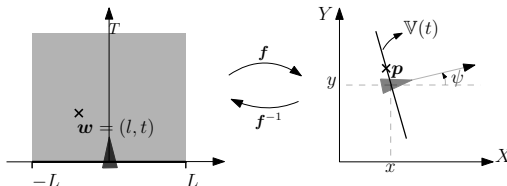
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Problem Statement

Visible Area

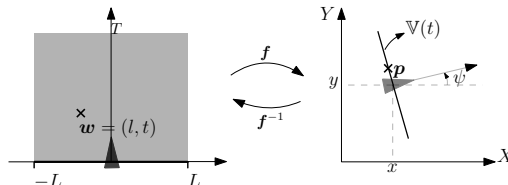
$$\mathbb{V} : [0, T] \rightarrow \mathcal{P}(\mathbb{R}^2)$$



Problem Statement

Visible Area

$$\mathbb{V} : [0, T] \rightarrow \mathcal{P}(\mathbb{R}^2)$$



Waterfall Space and Sweep Function

$$W = [-L, L] \times [0, T]$$

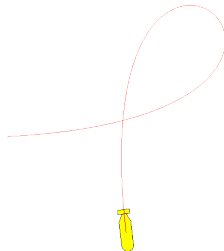
$$\mathbf{f} : W \rightarrow \mathbb{R}^2$$



Problem Statement

Robot's Trajectory

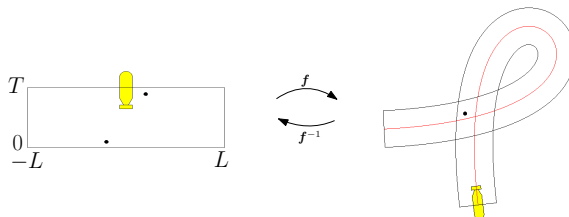
- $\mathbf{x} : [0, T] \rightarrow \mathbb{R}^2$,
- \mathbf{x} is differentiable in $[0, T]$.



Problem Statement

Explored Area

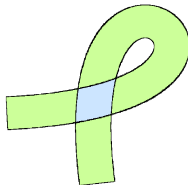
- $W = [-L, L] \times [0, T]$,
- $\mathbb{A}_{\mathbb{E}} = \mathbf{f}(W)$,
- Sensor's Contour $\gamma = \mathbf{f}(\partial W)$.



Problem Statement

Coverage Measure

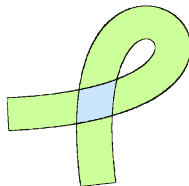
$$c_m(\mathbf{p}) = \#Ker(\mathbf{f} - \mathbf{p})$$



Problem Statement

Coverage Measure

$$c_m(\mathbf{p}) = \#Ker(\mathbf{f} - \mathbf{p})$$



$$A_E = \{\mathbf{p} \in \mathbb{R}^2 \mid c_m(\mathbf{p}) \geq 1\}$$



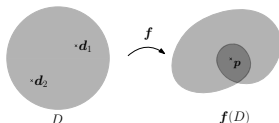
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Problem Approach

Topological Degree

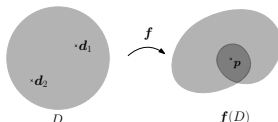
- D is an open subset of \mathbb{R}^n ,
- $f : \overline{D} \rightarrow \mathbb{R}^n$ is continuous,
- $p \in \mathbb{R}^n \setminus f(\partial D)$
- $\deg : (f, D, p) \rightarrow \mathbb{Z}$.



Problem Approach

Topological Degree

- D is an open subset of \mathbb{R}^n ,
- $\mathbf{f} : \overline{D} \rightarrow \mathbb{R}^n$ is continuous,
- $\mathbf{p} \in \mathbb{R}^n \setminus \mathbf{f}(\partial D)$
- $\deg : (\mathbf{f}, D, \mathbf{p}) \rightarrow \mathbb{Z}$.

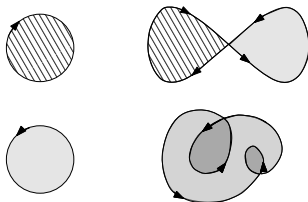


If $\det(\mathbf{f}'(\mathbf{d}))$ is non-zero on each \mathbf{d} such that $\mathbf{f}(\mathbf{d}) = \mathbf{p}$,

$$\deg(\mathbf{f}, D, \mathbf{p}) = \sum_{\mathbf{d} \in \mathbf{f}^{-1}(\mathbf{p})} \text{sign}(\det(\mathbf{f}'(\mathbf{d})))$$

Problem Approach

Winding Number



Winding Number :

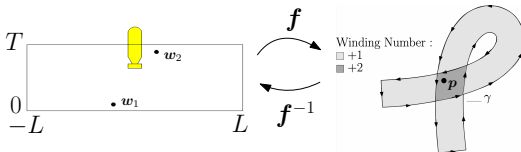
▨ -1 □ +1 ■ +2

- D is an open subset of \mathbb{R}^2 ,
- $f : \overline{D} \rightarrow \mathbb{R}^2$ is continuous,
- $p \in \mathbb{R}^2 \setminus f(\partial D)$,
- $\eta(f(\partial D), p) \in \mathbb{Z}$.



Problem Approach

For any $\mathbf{p} \in \mathbb{R}^2$, $c_m(\mathbf{p}) = \eta(\gamma, \mathbf{p})$



If $\det(\mathbf{f}'(\mathbf{w}))$ is positive on each $\mathbf{w} \in W$ such that $\mathbf{f}(\mathbf{w}) = \mathbf{p}$,

$$\eta(\gamma, \mathbf{p}) = \sum_{\mathbf{w} \in \mathbf{f}^{-1}(\mathbf{p})} \text{sign}(\det(\mathbf{f}'(\mathbf{w}))) = \# \text{Ker}(\mathbf{f} - \mathbf{p})$$



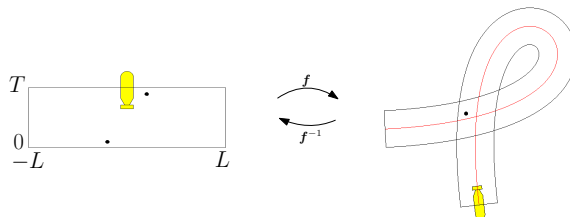
Costa Vianna M.L., Goubault E., Jaulin L., Putot S. (2022). Estimating the Coverage Measure and the Area Explored by a Side-Scan Sonar. *OCEANS 2022*



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- ④ **Sweeping backwards**
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- ⑥ Conclusions



Sweeping backwards

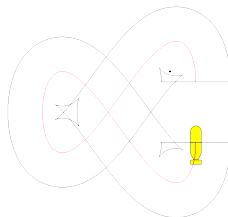


If $\det(\mathbf{f}'(\mathbf{w}))$ is positive on each $\mathbf{w} \in W$ such that $\mathbf{f}(\mathbf{w}) = \mathbf{p}$,

$$c_m(\mathbf{p}) = \eta(\gamma, \mathbf{p})$$



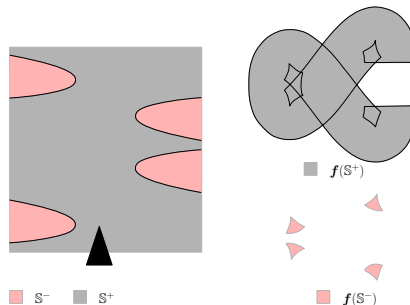
Sweeping backwards



$$Lx \quad \eta(\gamma, \mathbf{p}) = \sum_{\mathbf{w} \in f^{-1}(\mathbf{p})} \text{sign}(\det(\mathbf{f}'(\mathbf{w}))) = +1 - 1 + 1 = +1 \neq \#Ker(\mathbf{f} - \mathbf{p})$$



Sweeping backwards



$$S^+ = \{\mathbf{w} \in W | \det(\mathbf{f}'(\mathbf{w})) > 0\}, \gamma^+ = \mathbf{f}(\partial S^+)$$

$$S^- = \{\mathbf{w} \in W | \det(\mathbf{f}'(\mathbf{w})) < 0\}, \gamma^- = \mathbf{f}(\partial S^-)$$



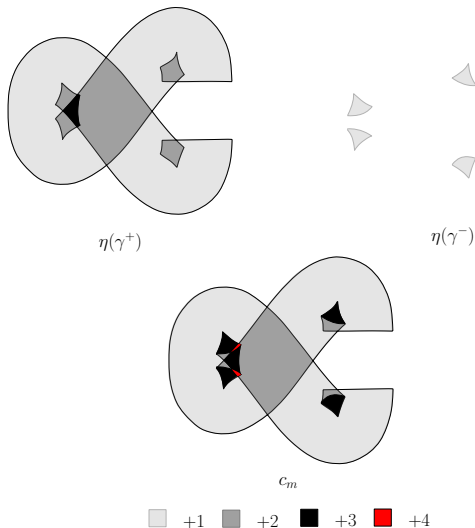
Sweeping backwards

$$c_m(\mathbf{p}) = \#Ker(\mathbf{f} - \mathbf{p}) = \#Ker(\mathbf{f} - \mathbf{p})|_{\mathbb{S}^+} + \#Ker(\mathbf{f} - \mathbf{p})|_{\mathbb{S}^-}$$

$$c_m(\mathbf{p}) = \sum_{\mathbf{w} \in \mathbf{f}_{|\mathbb{S}^+}^{-1}(\mathbf{p})} +1 + \sum_{\mathbf{w} \in \mathbf{f}_{|\mathbb{S}^-}^{-1}(\mathbf{p})} +1 = \eta(\gamma^+, \mathbf{p}) + \eta(\gamma^-, \mathbf{p})$$



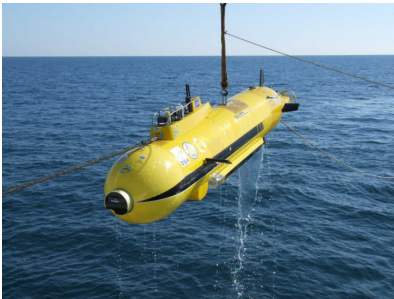
Sweeping backwards



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Daurade



Data

- DVL,
- IMU,
- Pressure.

Mission

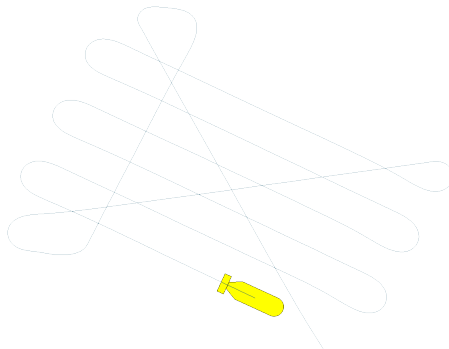
- Classical survey path (law-mowing pattern),
- Roadstead of Brest (France, Brittany),
- 47 minutes.



Dataset and photo courtesy of DGA/GESMA.



Daurade

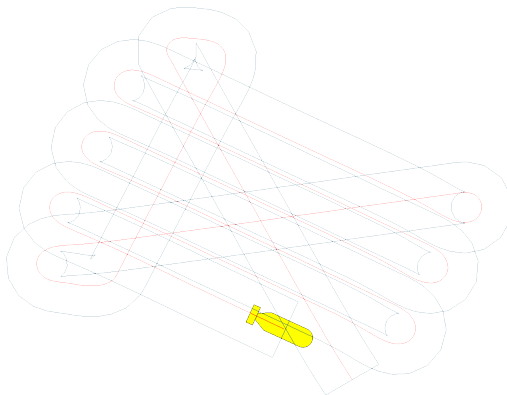


Using the Codac Library ¹

¹S. Rohou, B. Desrochers, et al., *The Codac library – Constraint-programming for robotics*, 2022



Daurade

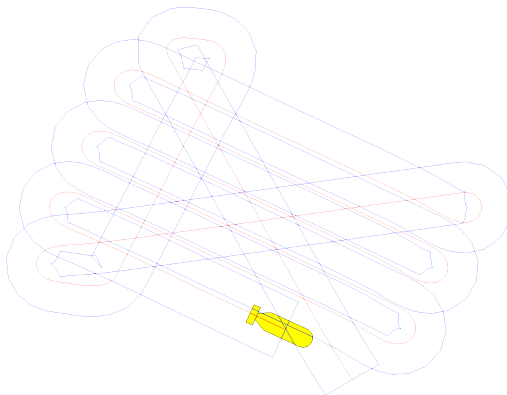


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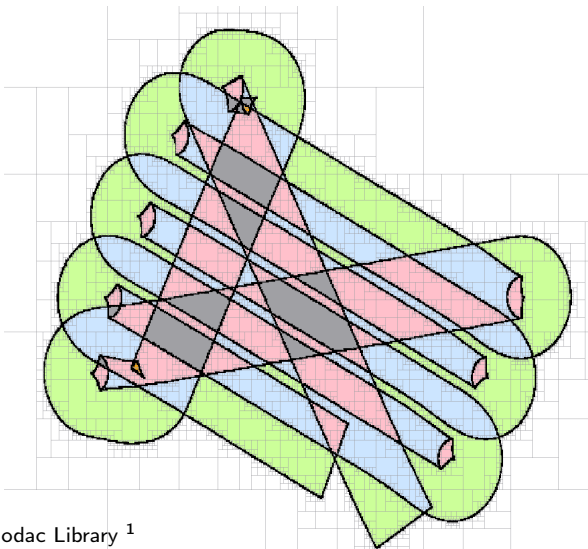


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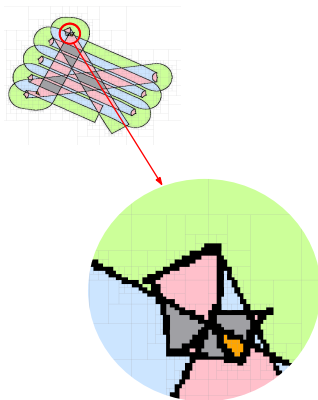


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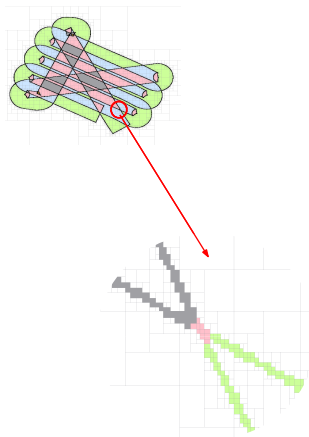


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Conclusions

- Relation between topological degree and exploration problem,
- coverage measure,
- algorithm for area characterization in terms of winding number.



Future Work

Extensions of the current method:

- Patch Exploration,
- uncertainty in the robot's trajectory using thick sets.

