



Stochastic control for underwater optimal trajectories

CQFD & DCNS

Inria Bordeaux Sud Ouest & University of Bordeaux
France

CQFD

Inria Bordeaux Sud Ouest

Outline

Presentation of CQFD

- Inria

- Themes

- Members

- Grants

Trajectories optimization for submarines

- Problem

- Solution

- Examples

How to join us

- Job opportunities at inria

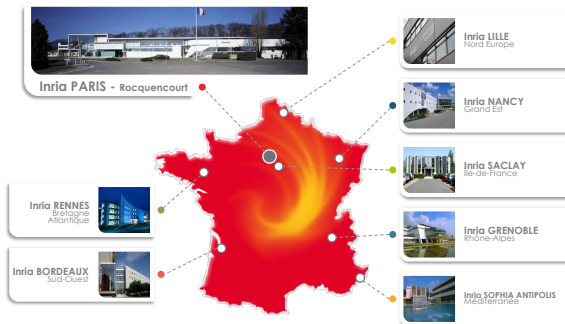


What is Inria ?

- ▶ Public science and technology institution established in 1967
- ▶ Only public research body fully dedicated to computational sciences
- ▶ Combining **computer sciences** with **applied mathematics**

- ▶ 8 research centers in France
- ▶ 3,400 researchers
1000 PhD students

Inria's Research Centres



Inria team CQFD

Inria research program on **Stochastic methods and models**

Research themes

- ▶ **Modeling** of random complex systems
- ▶ **Estimation** of model parameters and performances
- ▶ **Control** performance optimization

Tools

Probability and statistics



Members

Permanent members



François
Dufour
Head of team



Marie
Chavent



Benoîte de
Saporta



Anne
Gégout-Petit

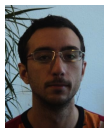


Jérôme
Saracco



Huilong
Zhang

PhD students



Romain
Azaïs



Camille
Baysse



Isabelle
Charlier



Karim
Claudio



Raphaël
Coudret



Amaury
Labenne



Shuxian
Li



Laurent
Vézard

+ 1 **internship** Christophe Nivot

Partnerships with industry

Astrium (space transportation)

- ▶ stochastic models for **crack propagation**
- ▶ maintenance optimization for a structure subject to **corrosion**
- ▶ optimization of the assembly line of the **new generation launcher**

DCNS (naval defense)

- ▶ optimization of trajectories for **submarines**

EDF (electricity)

- ▶ modeling of the failures in the secondary circuit of a **nuclear power plant**

Thales optronic (military equipment)

- ▶ health monitoring of an **optronic equipment**



Outline

Presentation of CQFD

Trajectories optimization for submarines

Problem

Solution

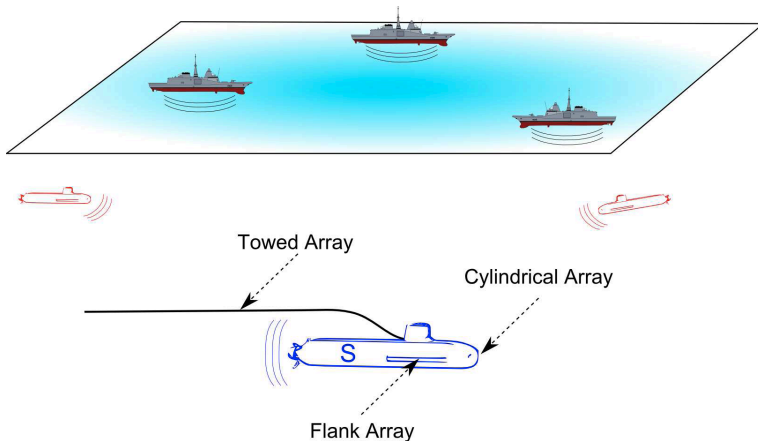
Examples

How to join us



Problem set by DCNS

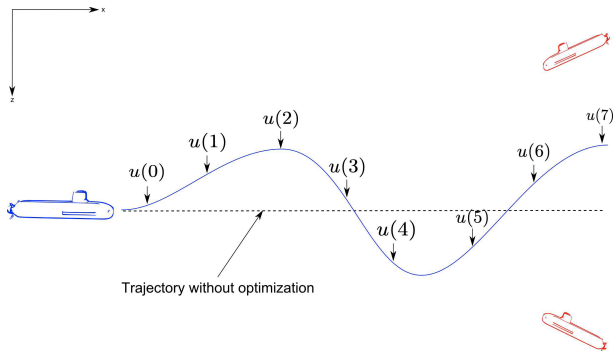
Submarine with **sensors** surrounded by **targets**



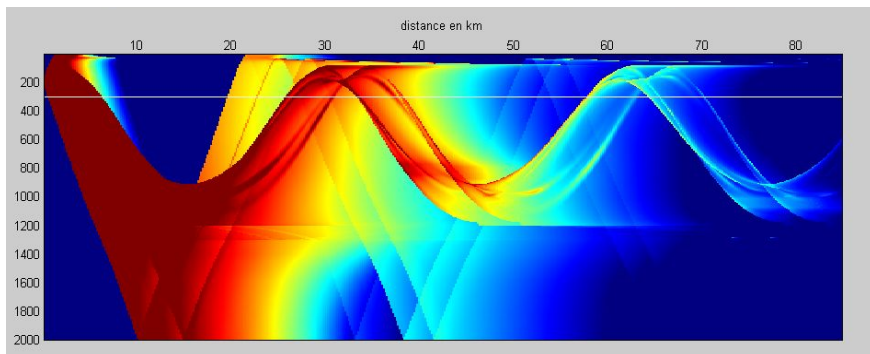
Aim

Optimization

Propose an **optimal** trajectory for the submarine to **hear** the targets at best at best



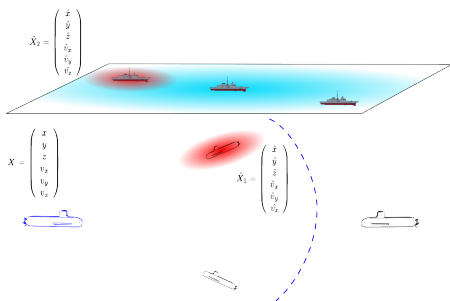
Difficulty: under water sound propagation



Solution proposed by CQFD

First step : Modeling

- ▶ position and speed of the submarine **known**
- ▶ position and speed of targets **unknown** \longrightarrow **random**
constant immersion and speed
+ **noise**



Second step : discretization

Aim

Turn the problem in **continuous** time and space into a problem in **discrete** time and space

Time discretization

time step $\Delta t = 1$ minute

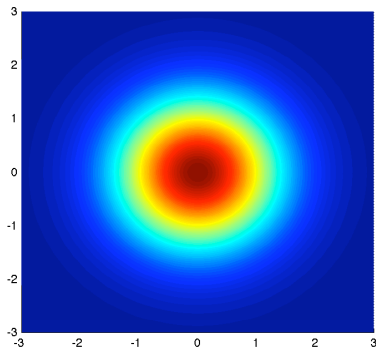
Discretization of the submarine position

Immersion grid with step $\Delta z = 6$ metres
maximal possible variation in 1minute: $\pm 4\Delta z$



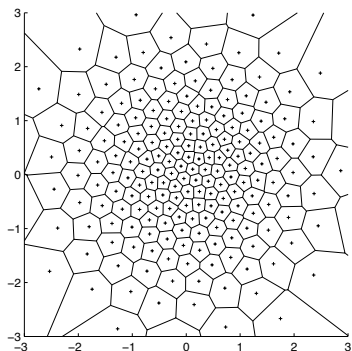
Discretization of targets position

Approximate **continuous** (position and speed of targets) random variables by **discrete** ones in an **intelligent** way



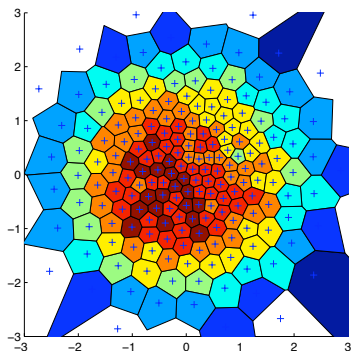
Discretization of targets position

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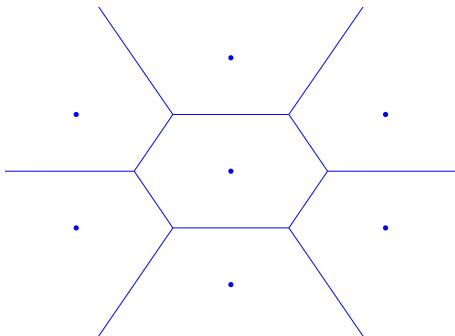
Discretization of targets position

Approximate **continuous** (position and speed of targets) random variables by **discrete** ones in an **intelligent** way



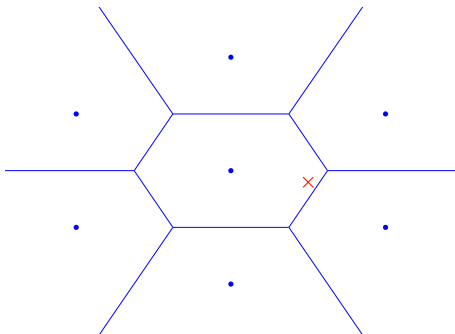
Algorithm

Model \longrightarrow simulator of trajectories \longrightarrow grids



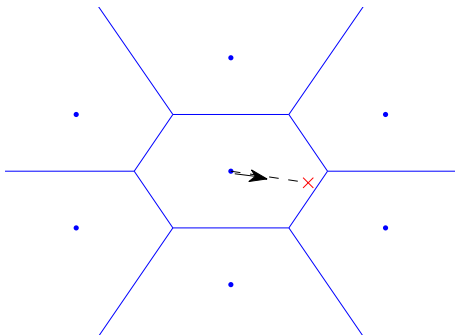
Algorithm

Model \longrightarrow simulator of trajectories \longrightarrow grids



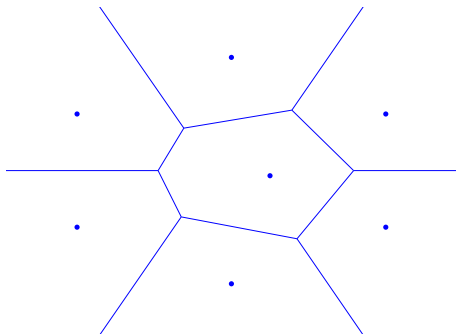
Algorithm

Model \longrightarrow simulator of trajectories \longrightarrow grids



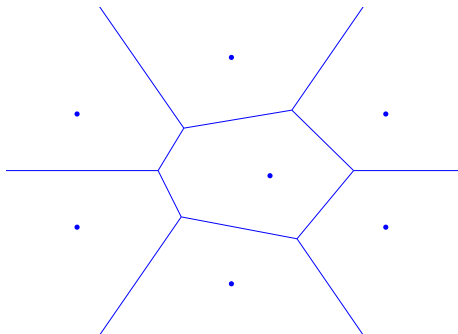
Algorithm

Model \longrightarrow simulator of trajectories \longrightarrow grids



Algorithm

Model \longrightarrow simulator of trajectories \longrightarrow grids



New observed position \longrightarrow nearest neighbor projection in the grid

Third step : mathematical formulation of the problem

Markov decision process (MDP)

$$(X, A, \{A(x), x \in X\}, Q, c)$$

- ▶ X state space, possible **positions** for the submarine and targets
- ▶ A action space, **possible maneuvers** for the submarine
- ▶ $A(x)$ possible actions at state x
- ▶ Q Markov kernel, gives the new **relative positions** of targets given the action chosen
- ▶ c performance function, **acoustic loss**



Dynamic programming

Optimal control problem for MDP

Find the policy $(a_0, a_2, \dots, a_{N-1})$ that minimizes the loss

$$J^*(x_0) = \min_{(a_0, a_2, \dots, a_{N-1})} \mathbb{E} \left[\sum_{n=0}^{N-1} c(x_n, a_n) + c(x_N) \right]$$

Solution by dynamic programming

- ▶ $J_N(x) = c(x)$
- ▶ $J_n(x) = \min_{a \in A(x)} \mathbb{E} \left[c(x, a) + \int J_{n+1}(y) Q(x, a; dy) \right]$
- ▶ $J_0(x) = J^*(x)$



Fourth step: numerical solution

Start with a **simplified** model and make it more realistic step by step

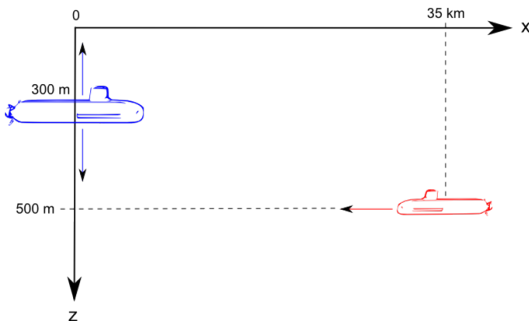
First models studied

- ▶ **one** target, **known constant** immersion, submarine maneuvers only in **immersion**
- ▶ **two** targets, **known constant** immersion, submarine maneuvers only in **immersion**
- ▶ **several** targets, **constant + noise** immersion, submarine maneuvers only in **immersion**

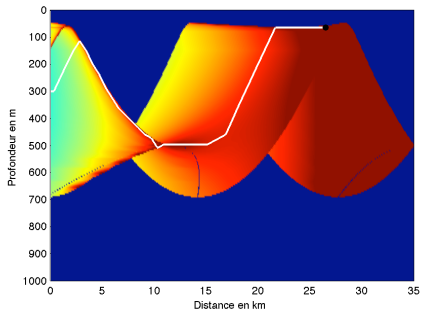


Problem: one target

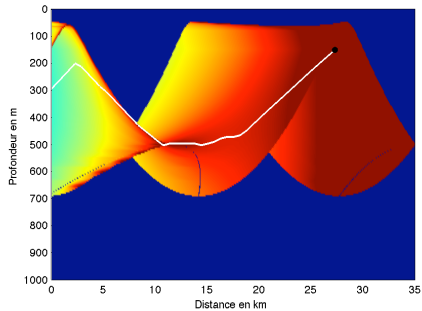
- ▶ immersion of target: 500 m , of submarine: 300 m
- ▶ initial distance between target and submarine: 35 km
- ▶ initial relative speed of target wrt submarine: -10 ms^{-1}
- ▶ computation horizon: 45 min



Results: one target



$$\Delta z = 12m$$



$$\Delta z = 6m$$

Results: two targets

Two targets

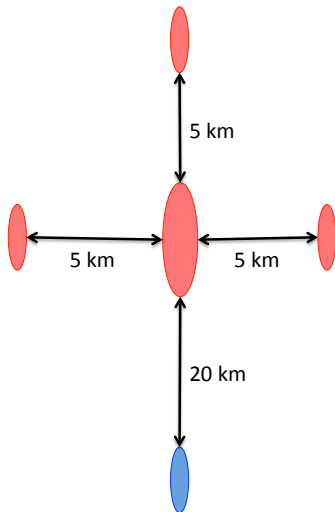
- ▶ immersion of targets: $500m$ and $100m$, of submarine: $300m$
- ▶ initial distance between targets and submarine: $35km$ $50km$
- ▶ initial relative speed of target wrt submarine: $-12ms^{-1}$
- ▶ computation horizon: $45min$



Results: four targets

Four targets

- ▶ immersion of targets: 600m, 300m, 100m et 400m, of submarine: 300m
- ▶ initial speed of targets 20 knots of submarine: 25 knots
- ▶ computation horizon: 45 minutes



Validation

Simple models

Advantages

- ▶ simpler problems to solve
- ▶ easy visual validation
- ▶ validation of practical feasibility

Drawbacks

- ▶ little realistic



Further works

- ▶ 3D maneuvers for submarine → long computation time



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- ▶ other types of mission: hear without being heard → constraints



Further works

- ▶ 3D maneuvers for submarine → long computation time
- ▶ other types of mission: hear without being heard → constraints
- ▶ ongoing work
use data from tracking algorithms to update target positions
→ sequence of short-term optimization problems



How to join us

Job opportunities at Inria

- ▶ internships
- ▶ PhD theses
- ▶ Post doc positions
- ▶ Permanent researcher positions

Have a look at Inria website

<http://www.inria.fr/en/centre/bordeaux/overview/offers/>

or contact the head of team François Dufour

francois.dufour@math.u-bordeaux1.fr

