

# A LINEAR APPROXIMATION FOR GRAPH-BASED SIMULTANEOUS LOCALIZATION AND MAPPING

AUTHORS

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AFFILIATION

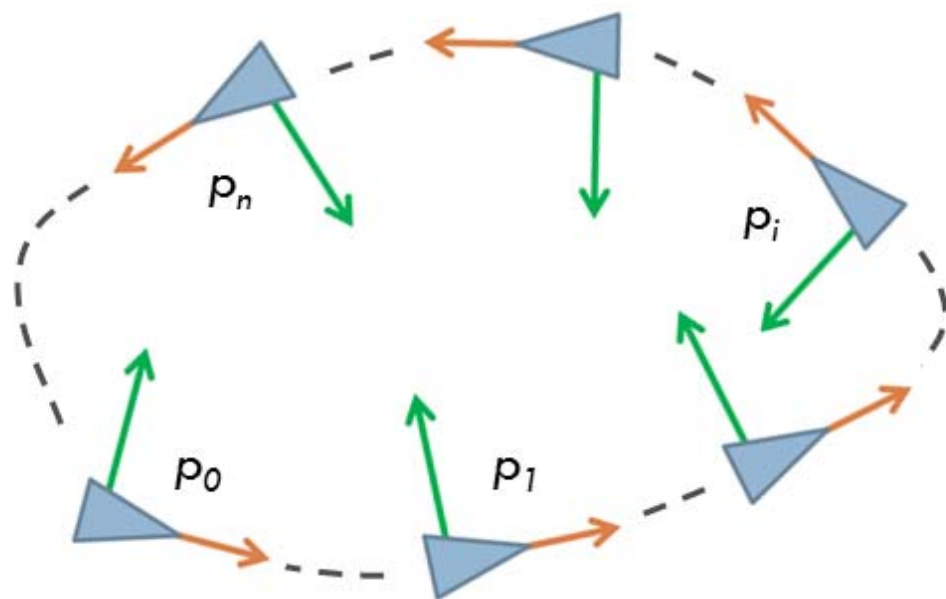
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# Full SLAM



**PROBLEM:** estimate the trajectory of a mobile robot (poses from time 0 to time  $n$ ) from relative pose information

**input:** relative pose measurements

$\xi_{ij} = p_j \ominus p_i + \xi_{ij}$ , and the corresponding uncertainty  $\xi_{ij} \sim N(0, P_{ij})$

**output:** maximum likelihood configuration

$P^* = \{p_0^*, \dots, p_n^*\}$

**A nonlinear non-convex optimization problem:**  $P^* = \operatorname{argmin} f(P)$

$$f(P) = \sum_{(i,j) \in \mathcal{E}} (p_j \ominus p_i - \xi_{ij})^\top P_{ij}^{-1} (p_j \ominus p_i - \xi_{ij})$$

# A Linear Framework

**Assumption:** for each relative pose measurement  $\xi_{ij} = [\Delta'_{ij} \ \bar{\delta}_{ij}]^T$  the relative position  $\Delta'_{ij}$  and the relative orientation  $\bar{\delta}_{ij}$  are independent, i.e.,  $P_{ij} = \text{diag}(P_{\Delta'_{ij}}, P_{\bar{\delta}_{ij}})$ .

## In a planar setup:

- the relative orientation measurements are linear
- the relative position measurements are also linear once robot orientations are known

Therefore our simple approach proceeds in three phases:

1. Compute an estimate of robot orientations from the relative orientation measurements (a *linear estimation problem!*)
2. Transform the relative position measurements in a common global reference frame, preserving the correlation (a *matrix-vector multiplication!*)
3. Solve the problem with the relative measurements expressed in the global frame, obtaining an approximation for  $P^*$  (a *linear estimation problem!*)

# A Linear Framework

We **prove** that:

The outcome of the three-phases procedure approximates the solution of the nonlinear maximum likelihood problem: the third phase produces a local correction of a **sub-optimal** configuration estimate computed in the first phase, leading it **towards a minimum of the cost function**.

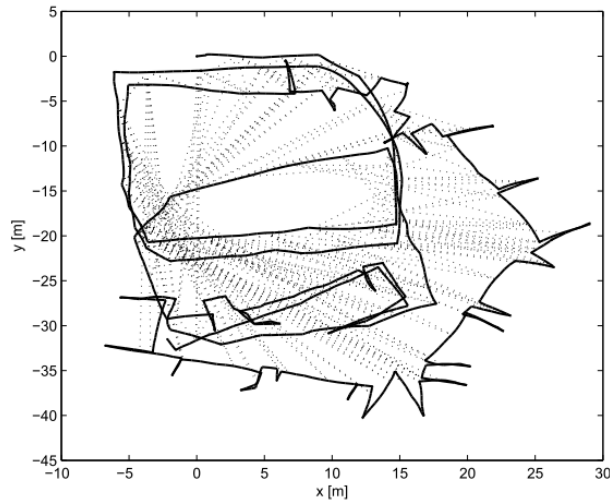
But there is a **trick**:

We are estimating angles in a linear framework: **what about the  $2\pi$  periodicity?**

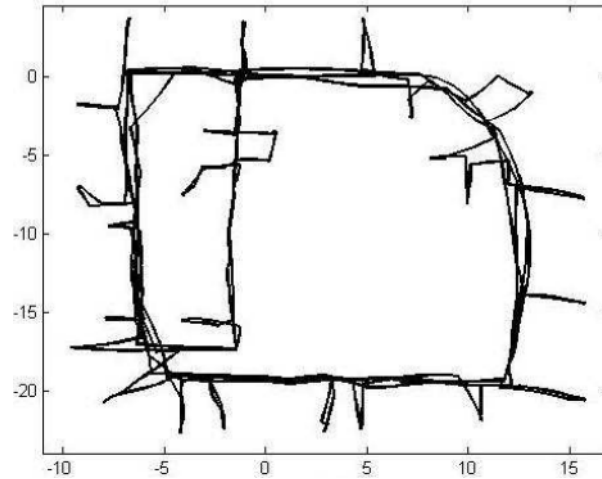
We show that a simple “**regularization**” of the orientation measurements allows to properly estimate the orientation of the robot and that this regularization **can be performed in every SLAM problem!**

# Impact

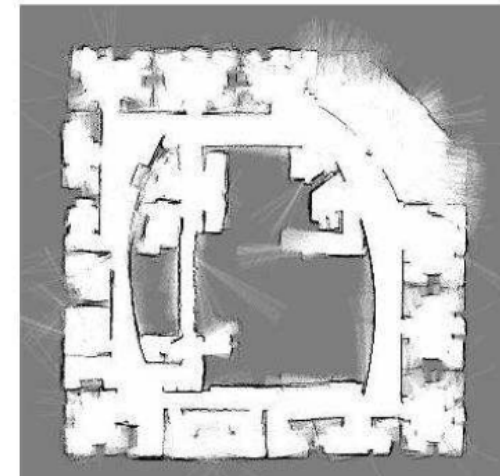
**INPUT**



**OUTPUT**



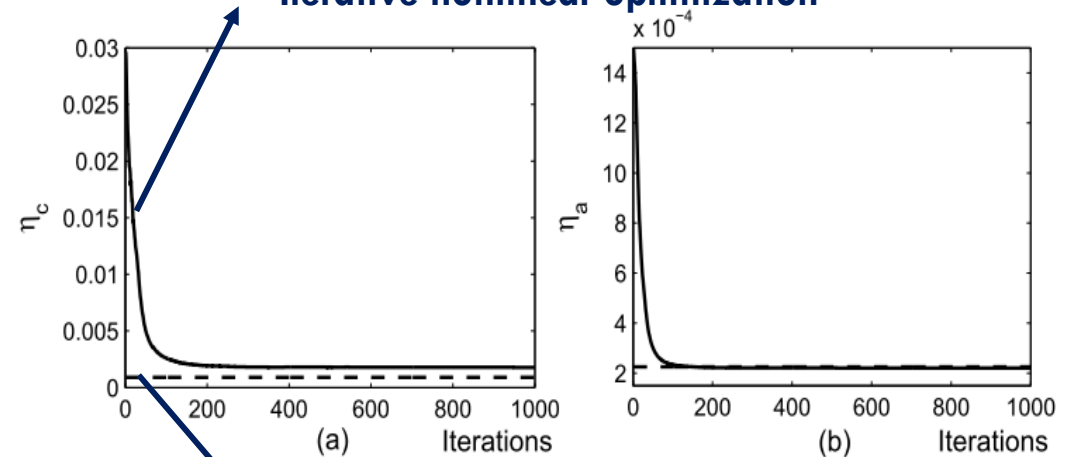
**MAP**



## ADVANTAGES

1. Closed-form linear solution
2. Needs no initial guess
3. Can be used for bootstrapping other iterative approaches
4. Already accurate in practice

## Iterative nonlinear optimization



## Proposed linear approximation



# Thank you for the attention

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