

Localization Tutorial

Phoenix Project

November 9, 2015



Funded by the
European Union

Outline



- 1 Localization Process in Phoenix
- 2 Localization techniques
- 3 Range-based Localization
 - Techniques & Notation
 - Localization ambiguities
 - Localization Complexity & Localizability Constraints
- 4 Summary

Outline



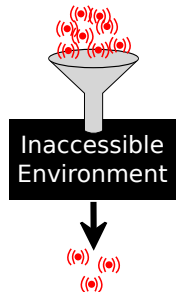
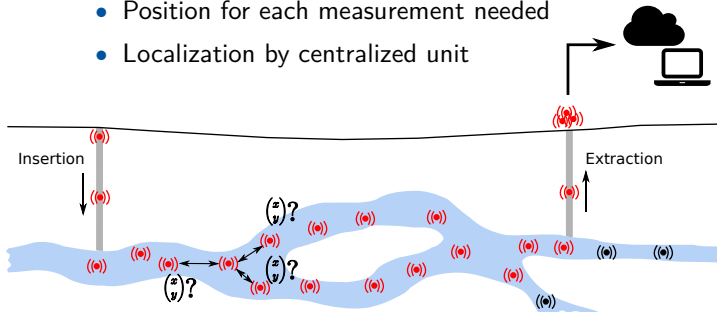
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Localization Process in Phoenix



Project goal

- Explore underground systems with sensors
- Sensor measurements enable e.g. temperature or pressure profiles
- Sensor positioning needed for measurement mapping
 - Position for each measurement needed
 - Localization by centralized unit



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Localization techniques



- **Anchor-based:** A subset of the nodes have a priori known positions. Nodes with unknown position use positioning information from anchors to determine their absolute position
- **Anchor-free:** No a priori knowledge on the positions of any node. Only relative coordinates can be obtained
- **Range-based:** Relative distances to other nodes are measured
- **Angle-based:** Angle information to other nodes is measured
- **Range-free:** Only connectivity information available

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Range-based Localization

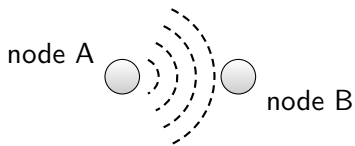


Figure: RSS measurement

System model:

$$P_r(d) = P_0 - 10\gamma \log_{10} d + S$$

$$\text{Var}(\hat{d}) \geq \left(\frac{\ln 10 \sigma_s}{10\gamma} d \right)^2$$

S : shadowing with variance σ_s^2

γ : path-loss exponent



Figure: Two-way TOA ranging

System model:

$$r(t) = \sqrt{E}p(t - \tau) + n(t)$$

$$\text{Var}(\hat{d}) \geq \frac{c^2}{8\pi^2 \beta^2 \text{SNR}}$$

$\text{SNR} \triangleq E/N_0$

β : effective bandwidth

$$\beta^2 = \int_{\mathbb{R}} f^2 |P(f)|^2 df / \int_{\mathbb{R}} |P(f)|^2 df$$

Range-based Localization



Figure: Two-way TOA ranging

- Bidirectional communication required
- Data stored by each sensor:
 - ID of node B
 - Time stamp
 - ToF or distance to node B (can be used for online sensor adaptation)

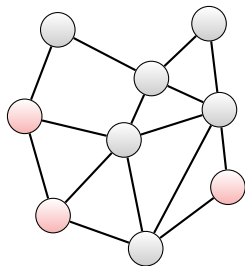
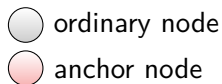


Figure: Example Network



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Range-based Localization



Localization problems due to ambiguities

- Consider simplified, noise-less case in 2D:
 - Two fixed nodes v_1, v_2 : known position
 - Localize v_3 's position
 - same measurements \rightarrow different solutions

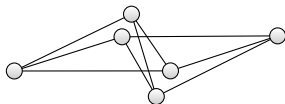
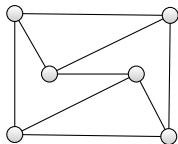
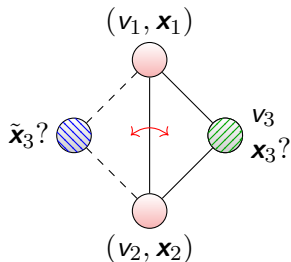


Figure: 3-connected graph with flex-ambiguity

- Realistic, noisy case:
 - Even more ambiguities present due to noise variance

Range-based Localization



Impact of noisy range measurements

- Three anchor (or already localized) nodes
- Fourth sensors to be localized
- Simplified case: noise only on measurements of v_3
 - By range measurement d_{34} , \tilde{d}_{34} : two possible solutions: x ,

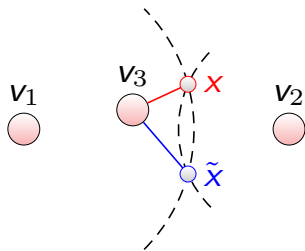


Figure: Network with noisy range measurements

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Complexity of Localization in noise-less case

The localization of sensors by means of range measurements is \mathcal{NP} -hard and it's of combinatorial nature (Complexity $\stackrel{a.s.}{\sim} \exp(\#\text{sensors})$).

- Special cases
 - Trilateration (Quadrilateration) graphs: polynomial (or even linear) in $\#$ sensors
 - There exists an ordering for $\mathcal{G} = (\mathcal{V}, \mathcal{E})$ in \mathbb{R}^d such that the sensors can be localized by $|\mathcal{V}| - d$ consecutive trilaterations

Range-based Localization



- Unique localizability constraints for noisy case unknown
 - For noise-less case in d dimensions
 - at least $d + 1$ anchors in *general* position
 - corresponding graph must be *globally rigid* and $(d + 1)$ -connected
 - k -connectivity: removing any $k - 1$ vertices doesn't render \mathcal{G} unconnected
 - Noise-less case in 2D:
 - Graph \mathcal{G} 6-connected \Rightarrow global rigidity
 - Graph $\mathcal{G}(R)$ 2-connected $\Rightarrow \mathcal{G}(2R)$ globally rigid
R: sensor communication range
 - Noise-less case in 3D:
 - Graph $\mathcal{G}(R)$ 2-connected $\Rightarrow \mathcal{G}(3R)$ globally rigid
- \Rightarrow High connectivity essential for sensor localizability

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Steps obtain sensor positions





- Collect timing or distance measurements from all agents
- Perform joint localization
 - Estimate agent positions at each measurement instance

Unique localization requirements in noise-less 3D case

- Minimal requirements: at least 4-connectivity
- No constructive criteria known
- Conjecture: 12-connectivity \Rightarrow global rigidity

References



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