

# Simultaneous Localization and Monitoring with Gaussian Processes

State of the Art Vortrag von Oliver Neumann

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# Agenda

Mapping vs  
Monitoring

Motivation

Gaußprozesse

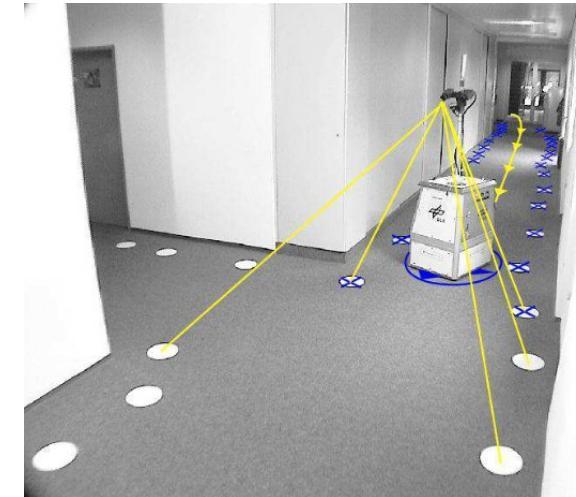
Aktuelle  
Forschung

Offene  
Forschungsfragen

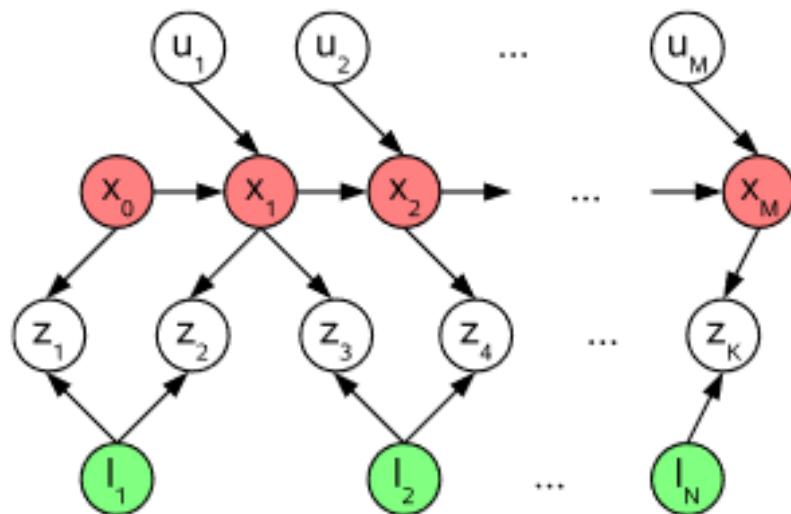
# Mapping vs Monitoring

SLAM: [Grisetti et al 2010]

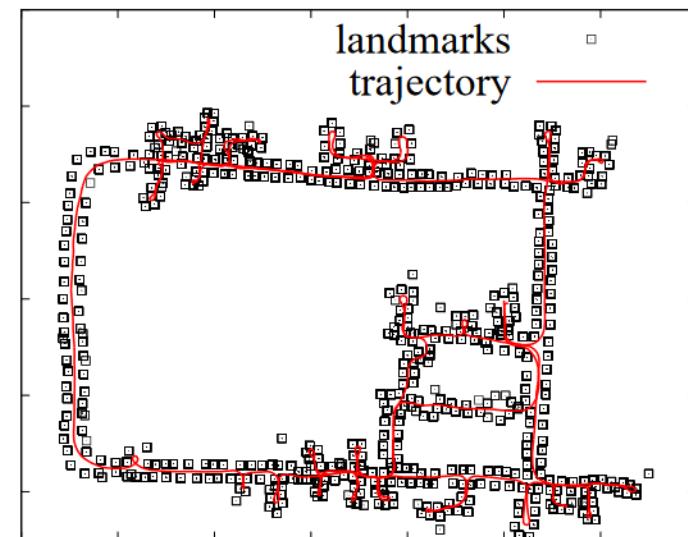
- Unbekannte Karte (**Mapping**)
- Lokalisierung in Karte
- Probabilistisches Verfahren
- Filtering vs Smoothing
- Graph basiert



[Grisetti et al 2010]



[Kaess et al 2008]

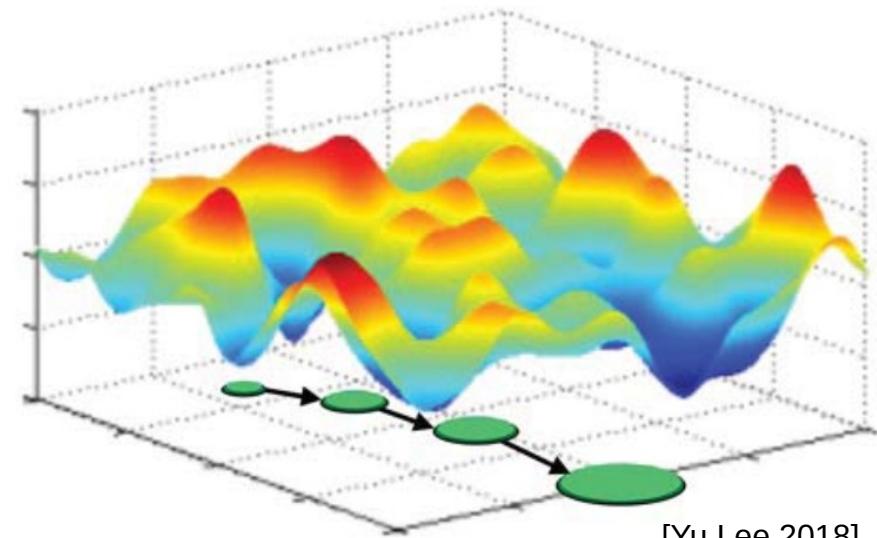


[Grisetti et al 2010]

# Mapping vs Monitoring



[Grisetti et al 2010]



[Yu Lee 2018]

Diskrete  
Landmarken

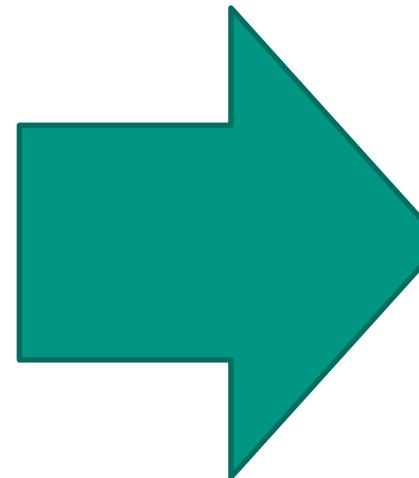
Kontinuierliche  
Funktion

# Motivation

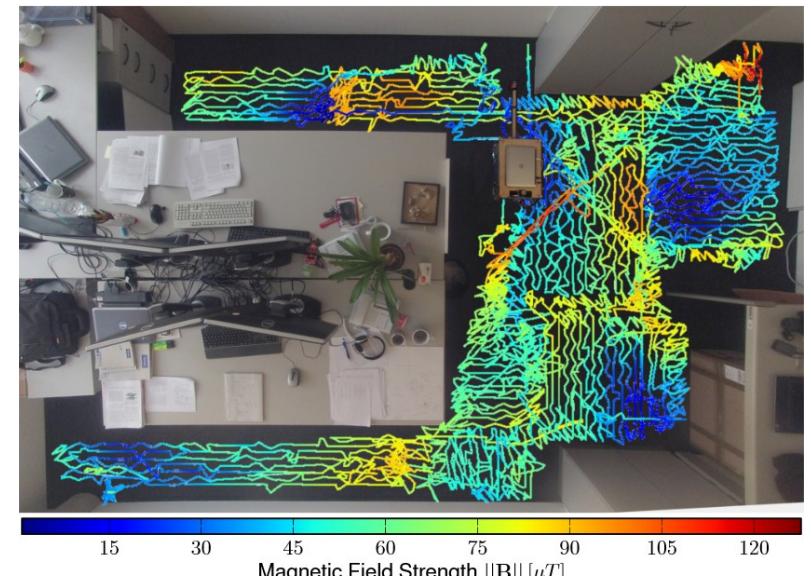
- Herausforderung
  - SLAM für **kontinuierliches Phänomen**
  - **Kein Wissen** über zugrundeliegende Funktion
  - **Unsicherheiten**
  - **Vorhersagegenauigkeit**
  - **Wenig Messungen**



[Image-Web1]



**Gauß-  
prozess**



[Wieser et al 2014]

# Gaußprozesse

- Stochastischer Prozess

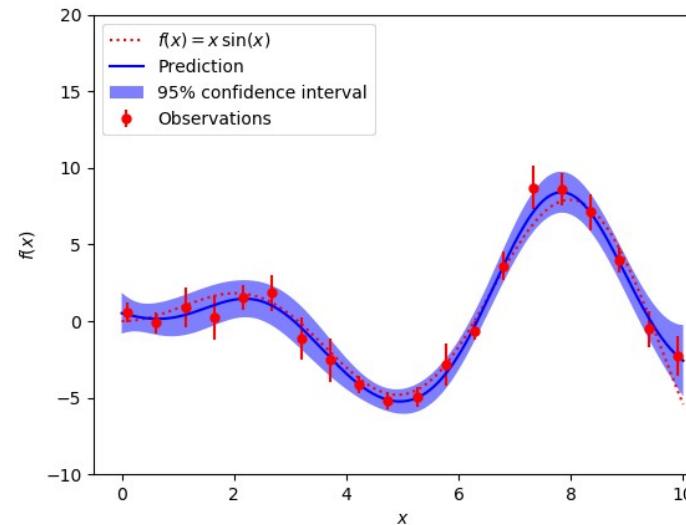
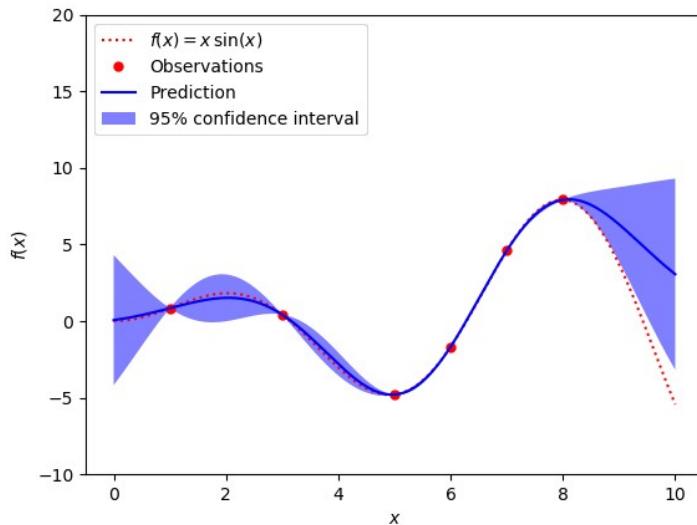
- Definiert über

- Erwartungswert

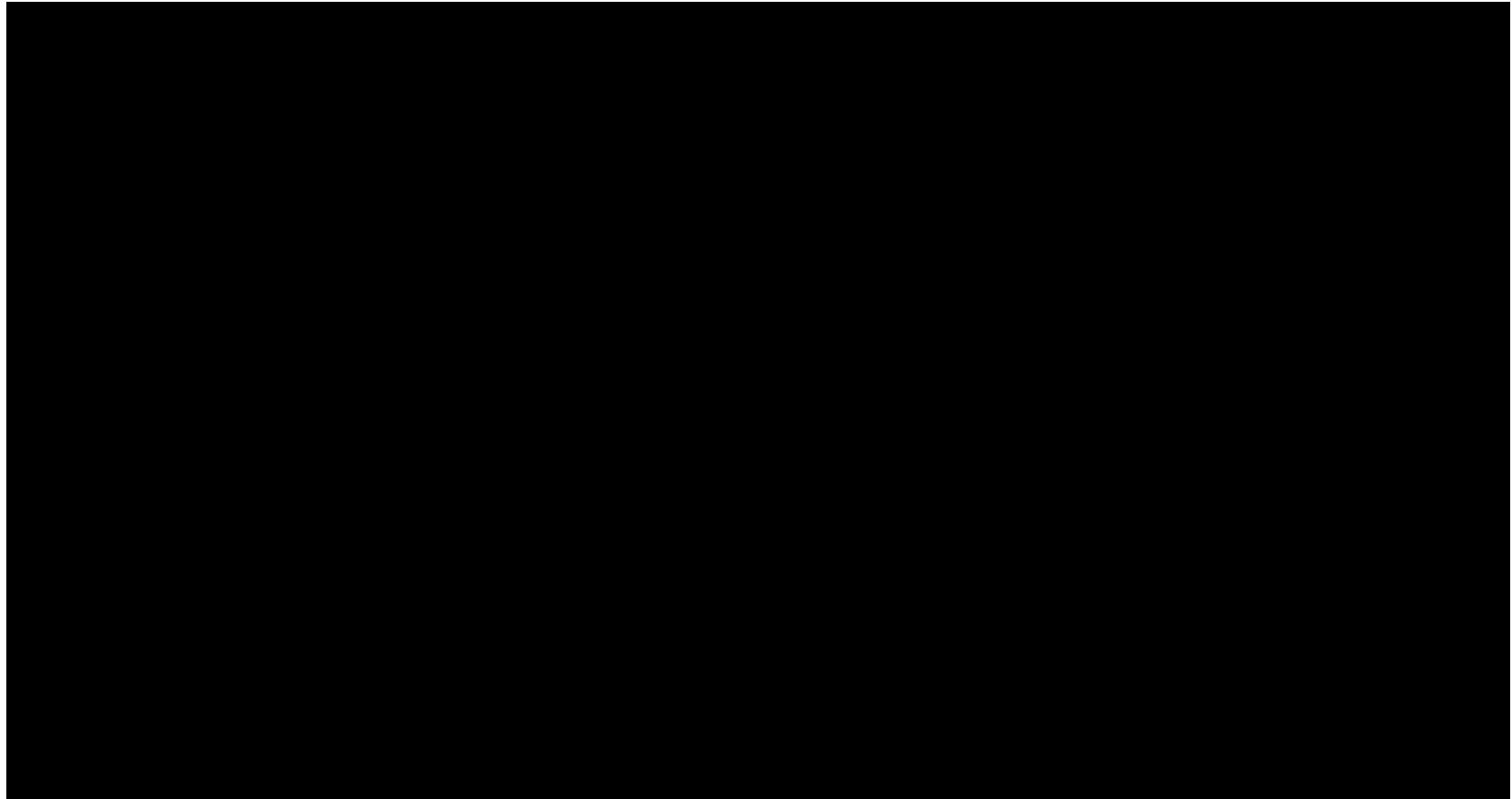
$$m(t)$$

- Kovarianzmatrix

$$k(x_i, x_j) = \begin{pmatrix} k(x_0, x_0) & \cdots & k(x_0, x_n) \\ \vdots & \ddots & \vdots \\ k(x_n, x_0) & \cdots & k(x_n, x_n) \end{pmatrix}, \quad i, j \in \{0, \dots, n\}$$



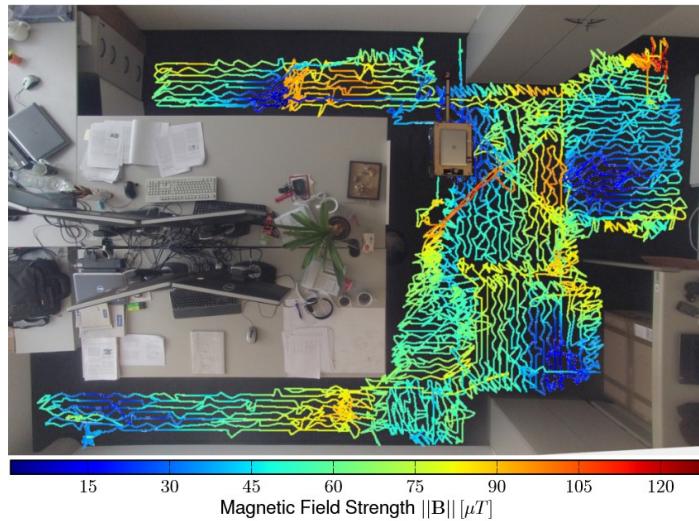
# Aktuelle Forschung



[Kok Solin 2018]

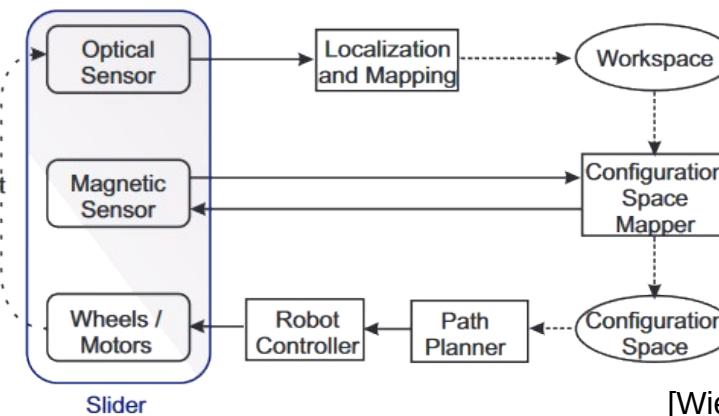
# Aktuelle Forschung

## Autonomous Robotic SLAM-based Indoor Navigation for High Resolution Sampling with Complete Coverage



[Wieser et al 2014]

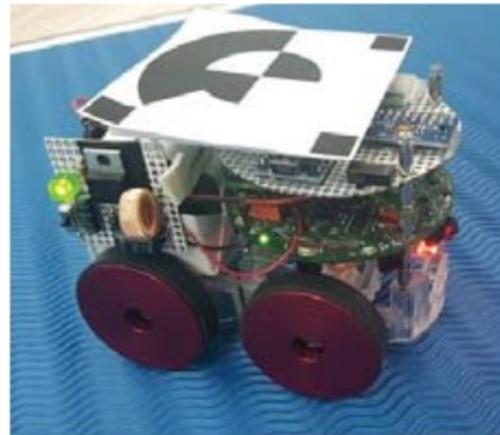
Change  
of  
environment  
due to  
robot's  
movement



[Wieser et al 2014]

# Aktuelle Forschung

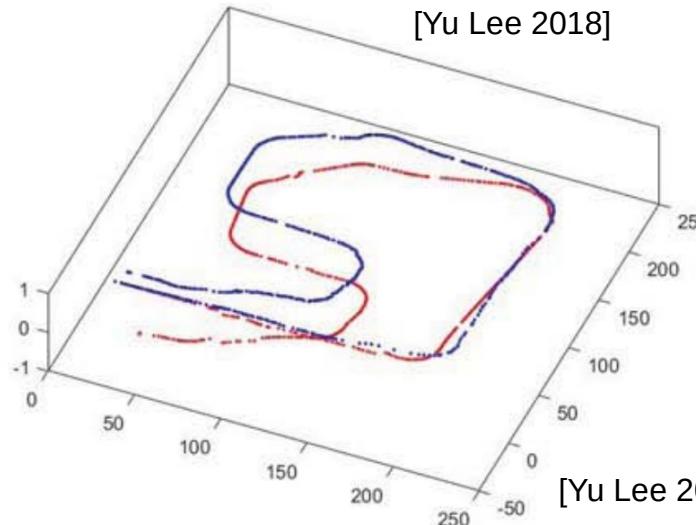
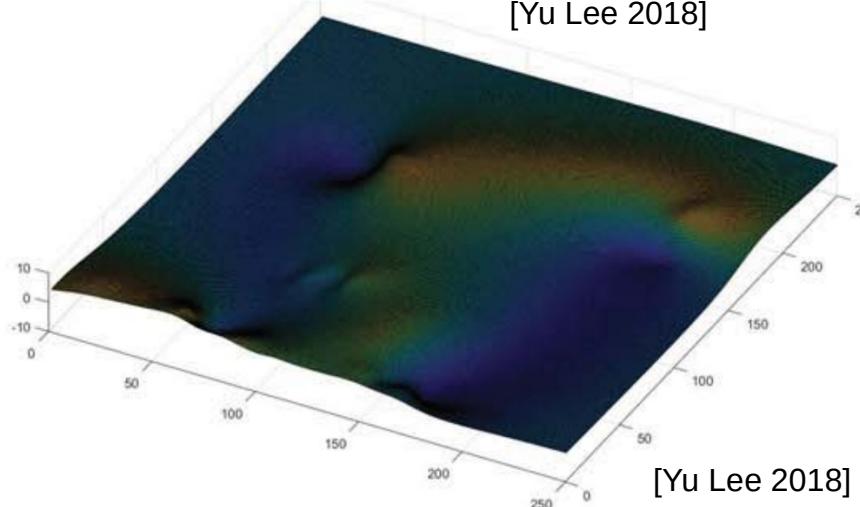
Terrain field SLAM and Uncertainty Mapping using Gaussian Process



[Yu Lee 2018]

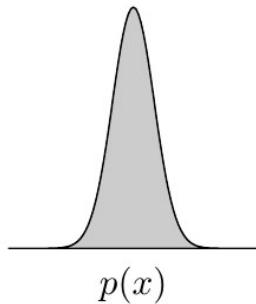


[Yu Lee 2018]

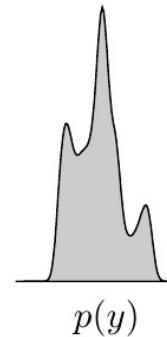


# Aktuelle Forschung

## Variational Inference for Uncertainty on the Inputs of Gaussian Process Models



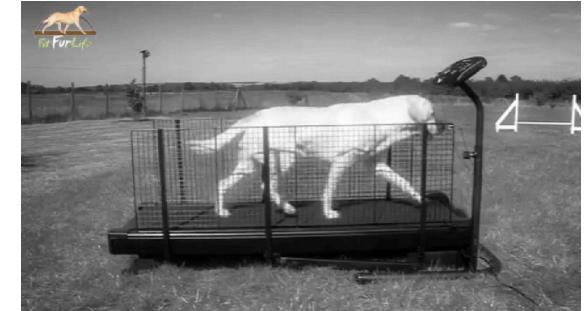
$$y = f(x) + \epsilon$$



[Damianou et al 2014]

$$\mathbf{z}_{i,:} = \mathbf{x}_{i,:} + \boldsymbol{\epsilon}_x,$$

$$p(\mathbf{X}|\mathbf{Z}) = \prod_{i=1}^n \mathcal{N} (\mathbf{x}_{i,:} | \mathbf{z}_{i,:}, \boldsymbol{\Sigma}_z)$$



[Damianou et al 2014]

# Offene Fragen

- Kombination Monitoring und SLAM
- Mathematische Formulierung des Problems (SLAM)
- Online Fähigkeit für SLAM mit Monitoring
- Unsicherheiten in Eingabe und Ausgabe mit abnehmender Unsicherheit

# Quellen

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*Scalable Magnetic Field SLAM in 3D using Gaussian Process Maps*
- [Grisetti et al 2010] Giorgio Grisetti, Rainer Kümmerle, Cyrill Stachniss and Wolfram Burgard 2010;  
*A Tutorial on Graph-Based SLAM*
- [Kaess et al 2008] Michael Kaess, Ananth Ranganathan and Frank Dellaert 2008;  
*iSAM: Incremental Smoothing and Mapping*
- [Yu Lee 2018] Hyeonwoo Yu and Beomhee Lee 2018;  
*Terrain field SLAM and Unertainty Mapping using Gaussian Process*
- [Damianou et al 2014] Andreas Damianou, Michalis Titsias and Neil Lawrence 2014;  
*Variational Inference for Uncertainty on the Inputs of Gaussian Process Models*
- [Wieser et al 2014] Iris Wieser, Alberto Ruiz, Martin Frassl, Michael Angermann,  
Joachim Mueller and Michael Lichtenstern 2014;  
*Autonomous Robotic SLAM-based Indoor Navigation for  
High Resolution Sampling with Complete Coverage*
- [Image-Web1] Anusuya Datta 2018;  
Indoor Positioning: *What do you do in a building when your GPS stops working?*  
<https://www.geospatialworld.net/blogs/indoor-positioning-indoors-gps-stops-working/>

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- [Huber 2013-1] Marco F. Huber 2013;  
*Recursive Gaussian Process Regression*
- [Huber 2013-2] Marco F. Huber 2013;  
*Recursive Gaussian Process: On-line Regression and Learning*
- [Dolgov Hanebeck 2018] Maxim Dolgov and Uwe D. Hanebeck 2018;  
*A Distance-based Framework for Gaussian Processes over Probability Distributions*