Universidade Federal de Minas Gerais
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Laboratório de Modelagem, Análise e Controle de Sistemas Não-Lineares

Sensor Fusion for Irregular Sampled Systems

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Contents

1 Introduction

1.1 Motivations

1.2 Problem Formulation

Apresentação matemática do problema, de forma ampla. Descrever as premissas adotadas.

1.3 Objectives

1 frase para o objetivo geral Objetivos específicos

1.4 Thesis Structure

2 Literature Review

2.1 Multi-Sensor Sytems

2.2 Irregular Sampled Systems

2.3 State Estimation Under Irregular Sampling

2.3.1 Known Measurement Instance

2.3.2 Unknown Measurement Instance

3 Material and Methods

3.1 Unscented Kalman Filter

3.2 Estimation With Timestamp

3.3 Estimation Without Timestamp

4 Results

4.1 Unicycle Position Estimation

4.1.1 Measurement Signal-to-Noise Ratio Variation

4.1.2 Average Sampling Rate Variation

4.1.3 Regular and Average Irregular Time Interval Relation Variation

5 Conclusion

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