

# Data driven modeling & control system design for HVAC system of an electric city bus - improving driving range & comfort

Citation for published version (APA):

Sarneizehdoost, S. (2019). Data driven modeling & control system design for HVAC system of an electric city bus - improving driving range & comfort: modeling air quality & thermal dynamics for E-bus & definition of multizone control strategy. Technische Universiteit Eindhoven.

#### Document status and date:

Published: 23/10/2019

### Document Version:

Publisher's PDF, also known as Version of Record (includes final page, issue and volume numbers)

### Please check the document version of this publication:

- A submitted manuscript is the version of the article upon submission and before peer-review. There can be important differences between the submitted version and the official published version of record. People interested in the research are advised to contact the author for the final version of the publication, or visit the DOI to the publisher's website.
- The final author version and the galley proof are versions of the publication after peer review.
- The final published version features the final layout of the paper including the volume, issue and page numbers.

Link to publication

### General rights

Copyright and moral rights for the publications made accessible in the public portal are retained by the authors and/or other copyright owners and it is a condition of accessing publications that users recognise and abide by the legal requirements associated with these rights.

- Users may download and print one copy of any publication from the public portal for the purpose of private study or research.
  You may not further distribute the material or use it for any profit-making activity or commercial gain
  You may freely distribute the URL identifying the publication in the public portal.

If the publication is distributed under the terms of Article 25fa of the Dutch Copyright Act, indicated by the "Taverne" license above, please follow below link for the End User Agreement:

www.tue.nl/taverne

If you believe that this document breaches copyright please contact us at:

providing details and we will investigate your claim.

Download date: 13. Jul. 2025



/ Department of Mathematics and Computer Science / PDEng Automotive Systems Design

# Data Driven Modeling & Control System Design for HVAC System of an Electric City Bus – Improving Driving Range & Comfort

Modeling Air Quality & Thermal Dynamics for E-Bus & Designing a Multi-Zone Control Strategy

**Executive Summary** 

October 2019

Sina Sarneizehdoost

# Data Driven Modeling & Control System Design for HVAC System of an Electric City Bus – Improving Driving Range & Comfort

Modeling Air Quality & Thermal Dynamics for E-Bus & Definition of Multi-Zone Control Strategy

Sina Sarneizehdoost

October 2019

Eindhoven University of Technology Stan Ackermans Institute - Automotive/Mechatronic Systems Design

PDEng Report: 2019/078

Public Executive Summary

**Partners** 



**VDL Enabling Transport Solutions** 

TU/e EINDHOVEN UNIVERSITY OF TECHNOLOGY

Eindhoven University of Technology

**Steering Group** Dr. Ir. Theo Hofman

Dr. Peter Heuberger Ir. Anouk Hol

Ir. Roshni Digumoorthi

Date October 2019

### Composition of the Thesis Evaluation Committee:

Chair: Prof. Dr. Henk Nijmeijer

Members: Ir. H.T.G. (Harold) Weffers, PDEng

Dr. P.S.C. (Peter) Heuberger

Dr. Ir. Theo Hofman

Ir. Anouk Hol

Ir. Roshni Digumoorthi

The design that is described in this report has been carried out in accordance with the rules of the TU/e Code of Scientific Conduct.

Date October, 2019

Contact address Eindhoven University of Technology

Department of Mathematics and Computer Science

MF 5.072 P.O. Box 513 NL-5600 MB

Eindhoven, The Netherlands

+31 402743908

Published by Eindhoven University of Technology

Stan Ackermans Institute

PDEng Report 2019/078

Abstract Fighting global warming is not possible unless every authority and

industry defines goals in that regard. Moving towards e-mobility in public transport level and encouraging people to use this facility is one of the key solutions on the table at many municipalities. However, in northern and central Europe the range of e-buses is reduced up to 60% in winter conditions due to the demanded heating energy for passenger and driver comfort. This range anxiety introduces scheduling complexities, delays and additional costs for bus fleet owners. This document presents an approach to reduce the energy consumption of electric buses by appropriately managing the temperature and air quality in different zones of the bus cabin. A model based thermal and air quality control system is developed

to realize this goal.

Keywords E-Bus Thermal Management System, Thermal Control System,

CO<sub>2</sub> Concentration model, Multi-zone modeling, Electric Buses,

**HVAC** 

Preferred reference S. Sarneizehdoost, Data driven modeling & conceptual control sys-

tem design for HVAC system of electric city bus. Eindhoven University of Technology, PDEng Report (2018/078), October 2019.

Partnership This project was supported by Eindhoven University of Technol-

ogy and VDL Enabling Transport Solutions

Disclaimer Endorsement Reference herein to any specific commercial products, process, or

service by trade name, trademark, manufacturer, or otherwise, does not necessarily constitute or imply its endorsement, recommendation, or favoring by the Eindhoven University of Technology and Company name. The views and opinions of authors expressed herein do not necessarily state or reflect those of the Eindhoven University of Technology and VDL Enabling Transport Solutions, and shall not be used for advertising or product endorsement pur-

poses.

Disclaimer Liability

While every effort will be made to ensure that the information contained within this report is accurate and up to date, Eindhoven University of Technology makes no warranty, representation or undertaking whether expressed or implied, nor does it assume any legal liability, whether direct or indirect, or responsibility for the accuracy, completeness, or usefulness of any information.

Trademarks

Product and company names mentioned herein may be trademarks and/or service marks of their respective owners. We use these names without any particular endorsement or with the intent to infringe the copyright of the respective owners.

Copyright

Copyright © 2019 Eindhoven University of Technology. All rights reserved. No part of the material protected by this copyright notice may be reproduced, modified, or redistributed in any form or by any means, electronic or mechanical, including photocopying, recording, or by any information storage or retrieval system, without the prior written permission of the Eindhoven University of Technology and VDL Enabling Transport Solutions.

### **Foreword**

i

The shift towards electric mobility has a positive impact on the environment. However, it comes with its challenges too, the range of the electric vehicle being one of the main ones. To enhance the range of the electric bus, the various subsystems have to be optimized, both in design as well as energy consumption. The climate system being one of the main energy consumers, a need for the development of an energy efficient thermal management system was realized. Sina's assignment involved the design of a thermal management system and the development of an air quality model of the bus cabin. He also had to improve the existing thermal model of the bus cabin. Both the thermal model and the air quality model are sufficiently validated. These models were then used to develop optimal controllers to regulate the cabin temperature and air quality, performing a trade-off between energy consumption and passenger comfort. The results show promising improvements of about 15% energy savings in the climate system, hence making a good step towards fighting range anxiety. Sina has made a good effort to make the usage of the models and thermal management system user friendly, which is very useful in future development and testing.

Roshni Digumoorthi,

Energy Management Specialist @ VDL ETS

Energy Management Team, Concept Development Department

September 27<sup>th</sup>, 2019

Technische Universiteit <b>Eindhoven</b> University of Technology

### **Preface**

This report is the final assignment for the Professional Doctorate in Engineering (PDEng) degree in Automotive Systems Design (ASD) at Eindhoven University of technology (TU/e). The design and study represented in this report is developed under the collaboration between VDL Enabling Transport Solutions (ETS) and Eindhoven University of Technology. This project has been made possible by the funding of Electric Mobility Europe and the European Commission in the context of the COSTART Project, as part of the ERA-NET Co-fund scheme under Horizon 2020.

The main aim of this work is to represent a conceptual design of a smart Thermal Management System (TMS) that can consume less energy on HVAC system during the winter conditions in order to improve the driving range of VDL's electric buses, and to model the dynamic behavior of  $CO_2$  concentration in the e-bus cabin to control it for human comfort goals and combined energy saving strategies. This report covers the high-level design of the TMS, and the derivation of fundamental requirements for its future development. Furthermore, basic saving strategies have conceptually showed insights on future developments of the system and next steps towards integration of electric mobility in public transport systems.

Chapter 1 and Chapter 2 are interesting for readers who are interested in having an overview of the context and challenges related to multi-zone thermal management of e-buses and smart control system design.

Chapter 3 and Chapter 4 are mainly devoted to technical details for thermal and  $CO_2$  concentration models, therefore, these chapters are mainly interesting for domain specialists in thermal domains and particle concentration domains for human comfort.

Chapter 5 is describes the control techniques and strategies utilized to design a conceptual smart system which can manipulate systems modeled in previous chapters in order to obtain the desired goals of the work. This chapter can be interesting for domain specialists in control engineering and specifically thermal process control engineers.

Results reported in Chapter 6 can be particularly important for industrial partners such as VDL-ETS for defining the road map for future developments.

Sina Sarneizehdoost September 17<sup>th</sup> 2019



## Acknowledgements

The opportunity I had with this project was a great chance to build up experience and develop my knowledge. Therefore, I consider myself a very lucky individual who was granted the chance to work on such a challenging project with an environmentalist topic. First of all, I'd like to thank Electric Mobility Europe and the European Commission in the context of the COSTART Project, for supporting this project. In addition, I'd like to thank all the COSTART project partners and management that helped making the COSTART project a reality.

I am glad to mention a special word of thanks to my company supervisor Ir. Anouk Hol for her invaluable help at critical points of this project and Ir. Roshni Digumoorthi for her sharp comments and daily help during every single step of this work. I would like to expand my gratitude to the entire Concept Development Team at VDL ETS, for their thoughtful comments and questions during monthly team meetings and their contribution to such a friendly work environment which is valuable in the success of this work.

I would like to express my deep gratitude and appreciation to my TU/e supervisor, Dr. ir. Theo Hofman for his insightful comments and continuous guidance, every valuable comment was a key to solve a block I was facing along this work. Additionally, I am very honored for granting me the responsibility to represent TU/e in the COSTART project.

I like to use this opportunity to express my thankfulness to my senior ASD colleague Davide Occello for quality of his work and building a platform for me to continue this project. Also a special thanks goes to Dr. Peter Heuberger for granting me the opportunity to join ASD community and his endless support during the last two years. And I express my sincere thanks to Ellen van Hoof-Rompen, providing such a kind support for everyone, including me, in the ASD community. I would also like to extend my thankfulness to all my dear professors during my academic study for sharing their expertise, I daresay they have a significant contribution in this work.

I perceive this as an opportunity to express my warm gratitude to dear ASD / MSD / ST - 2017 colleagues for creating a unique experience of working together and exchanging fantastic ideas while enjoying a friendly teamwork.

At the end, my great thanks goes to my family and friends who have always been extremely supportive at every moment of my life.

Sina Sarneizehdoost September 23<sup>th</sup> 2019



# **Executive Summary**

Aiming at zero emission and increasing demand for higher efficiency without sacrifice in performance has pushed the industry towards electrification. The automotive industry is not an exception to this transition. However, this transition is not similarly simple in every industry. One of the most important challenges in the automotive industry and specifically in public transport is the range anxiety which delays the integration of e-mobility in public transport fleets.

The challenge arises when e-buses experience severe weather conditions specifically in northern and central Europe, where the range of these buses is reduced up to 60% every winter due to heating and comfort requirements, a situation which introduces scheduling complexities for the bus fleet owners and increases the total cost of ownership for fleet operators and municipalities.

Currently HVAC systems of the electric buses are working independent of the number of passengers on board. In addition, comfort criteria such as CO<sub>2</sub> concentration have not been taken into consideration as a controllable parameter and it has usually been feed forward controlled according to the maximum capacity of the public transport vehicle. That results in consuming more energy in conditions when the vehicle is not running at full passenger capacity. Therefore, the potential for energy saving and consequently range extension is considerably high.

One of the greatest challenges in optimizing the energy consumed by the HVAC system in an e-bus is accuracy in modeling the dynamics of thermal behavior and comfort criteria behavior. First of all, there are limited studies in this domain for automotive applications and they are not sufficiently accurate. Thus, considerable effort goes to improving the accuracy of available models in the thermal domain and modeling and validation of  $CO_2$  concentration dynamics.

Additionally, a definition of a multi-zone thermal management strategy in e-bus passenger cabin is proposed. This strategy is fitted to a conceptual thermal management and control system design in order to reduce energy consumption and follow the required trajectory dictated by comfort indicators. As a result, based on mutual control of  $CO_2$  concentration and air temperature in specified zones, TMS is showing up to 15% energy saving in the HVAC system. This achieved energy saving can be used to extend vehicle range.

VDL is producing a variety of e-buses which are used in various weather conditions in northern and central European countries. In this regard, each product type comes with an HVAC system, and thus, improving the energy consumption by this system in every product can lead to an extension in the range of total fleet of public transport in target countries.

Technische Universiteit <b>Eindhoven</b> University of Technology

# **Bibliography**

- [1] CAFCR, A Multi-view Method for Embedded Systems Architecting; Balancing Genericity and Specificity. Gerrit Muller 2018
- [2] Systems Engineering: Principles and Practices . Alexander Kossiakoff, William N. Sweet 2011 P.266.
- [3] Optimal bus temperature for thermal comfort during a cool day, applied ergonomics, KB Velt and HAM Daanen, 62:72-76,2017.
- [4] Ventilation for acceptable indoor air quality. American Society of Heating, Refrigerating, and Air-Conditioning Engineers ASHRAE, ANSI/ASHRAE Standard 62.1-2010 Inc.: Atlanta, GA.
- [5] Sick building syndrome solutions, Professional Safety K. Arnold, 2001 vol. 46, pp. 43-44
- [6] Vehicle interior air quality conditions when travelling by taxi, T.Moreno, A.Pacitto, A.Fernandez, F.Amato, Environmental Research 172 (2019) 529 542
- [7] Modeling CO2 Concentrations in Vehicle Cabin, SAE International, Heejung jung Univ. of California-Riverside 2013
- [8] Modelling indoor air carbon dioxide concentration using grey box models Marcel Macarulla, Miquel Casals, Matteo Carnevali, Nuria Forcada, Marta Gangolells 2017
- [9] Test on ventilation rates of dormitories and offices in university by the CO2 tracer gas method, W. Zhang, L. Wang, Z. Ji, L. Ma, Y. Hui Procedia Eng, Elsevier, 2015, pp. 662e666
- [10] E-Bus Multi-zone Thermal Management System Design, Design of a Thermal Management System and a Framework for Modeling E-Bus Multi-Zone Thermal and Air Quality Dynamics, D. Occello, PDEng Report 2018/090, October 2018, TU/e
- [11] Control-oriented Modeling of an Electric Bus HVAC System, Roshni Digumoorthi, June 2017, TU/e
- [12] Optimal Control Linear quadratic Methods Anderson B. D. O., J. B. Moore, Prentice Hall, 1989
- [13] Advanced and Multivariable Control Riccardo Scattolini, Lalo Magni, Pitagora Editrice Bologna
- [14] Evaluation of hourly tilted surface radiation models, DT Reindl, WA Beckman, and JA Duffie, Solar energy, 45(1):9-17, 1990.
- 1 Data driven modeling & control system design for HVAC system of an electric city bus

