Otto-von-Guericke-University Magdeburg Faculty of Electrical Engineering and Information Technology Chair for Automation Technology/Modeling

# Non-Technical Project Task Assignment



# Literature survey on fuel cell modeling: Automotive applications

submitted: October 27, 2022

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#### Task of the Non Technical Project in the Original:

Fuel cell technology is an important pillar for the wider use of regenerative energy, i.e. via intermediate storage as hydrogen. Replacing fossil fuel burning engines in automotive applications with fuel cells and electrical engines is one of the most promising ways to reduce local  $CO_2$  emissions in the mobility and transport sector. Mathematical models of fuel cells can be used to improve their optimal and safe operation in automotive applications.

This work aims at providing an overview on the current state of the art of fuel cell modeling in automotive applications on the system level, namely of the fuell cell stack and peripheral components required for hydrogen supply, air supply, humidification, and cooling. The focus is on identifying high quality publications, i.e. those with well justified and documented models, and high quality active research groups.

The main objective of this work is literature analysis.

#### Declaration by the candidate

I hereby declare that this thesis is my own work and effort and that it has not been submitted anywhere for any award. Where other sources of information have been used, they have been marked.

The work has not been presented in the same or a similar form to any other testing authority and has not been made public.

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Magdeburg, October 27, 2022

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## **1** Introduction

Reducing the use of fossil fuels and moving towards sustainable forms of energy has been one of the most important challenges of the 21st century. Fossil fuels are not only dangerous to our environment but are also finite, it is estimated that we have only about 70-150 years until these resources deplete(Sopian and Wan Daud 2006; Daud et al. 2017). In the wide variety of renewable forms of energy, hydrogen is one of the promising fuels that could transform the way we use energy. Automobiles/ Transport sectors is one of the major forms of carbon pollution as well as a huge source of particulate matter emissions. Fuel cells are one potential alternative to replace the fossil fuel burning engine(Daud et al. 2017).

Significant improvements are being made in the design, control and development of fuel cells since their commercialization. This paper aims to provide an overview of the latest trends in Fuel cell modelling and its peripheral components in automotive vehicles. There are various types of fuel cells such as alkaline fuel cells (AFCs), direct methanol fuel cells (DMFCs), microbial fuel cell (MFCs), molten carbonate fuel cells (MCFCs), proton exchange membrane fuel cells (PEMFCs) and solid oxide fuel cells (SOFCs)(Sopian and Wan Daud 2006; Daud et al. 2017). The focus of this paper is on Proton Exchange Membrane Fuel Cell also referred to as PEMFC's or PEM Fuel Cells. This field is a highly active area for research with research groups from various universities, research institutes and countries publishing their research in top journals. This paper aims to paint a big picture about the latest trends on Fuel cells in automotive applications particularly the work being done in modelling of fuel cells and its peripheral components such as humidifiers, air supply, hydrogen supply and cooling.

The research in PEM fuel cell modeling started with the works of Springer et al. and Bernadi and Verbrugge in 1990's, these were simple one dimensional models and continuous research has led to the development of complex 3D models since then(Secanell et al. 2017). There are currently different types of models that are being developed for different investigations, a fuel cell model would be broadly categorized in three categories "analytic, semi-empirical, or mechanistic (theoretical)"(Cheddie and Munroe 2005).A detailed chronological review about modeling of fuel cells can be found in the article by M.Secanell et.al(Secanell et al. 2017) however our study is focused on identifying the current state of art models which are well documented and are specifically focused towards fuel cells and its auxiliary components in an automotive setting.

This paper is mainly divided in four parts which are Data Collection, Quantitative

Analysis, Qualitative Analysis and Summary. In the first part we discuss on the selection of database and the method of collecting articles by means of a search expression. The method of formulating the search expression is discussed and the final outcome from the search is detailed. In the second and third part we interpret and analyse the collected articles with a variety of parameters and arrive at the conclusion in the last part.

## 2 Data Collection

#### 2.1 Selection of database

To find an initial list of research articles three databases were compared which were Google scholar, Web of Science (WoS) and Scopus (Elsevier). The database was chosen based on a couple of criteria such as Advanced search, ability to add filters for multiple categories, ability to export the data for further processing. Although the results provided by these search engines were similar, each one of the databases had different features to search and filter the data. Google Scholar and WoS had an advanced search feature but the former did not have filters and the ability to export all results. Scopus had less filter options than WoS with the option of Publisher missing, it also did not have the ability to keep a history of searches and the export option provided a link in the mailbox to download the results with more papers taking higher processing time whereas WoS directly downloaded the result. Among the three databases only WoS provided the most features like Advanced Search, filters and the ability to export results in multiple formats such as excel and text and also provided extra insights such as author profiles, citations with its trends in a nice graph with a history of all the search results. Based on the criteria of having the most features and ease of use, WoS was chosen as the database to search the publications.

#### 2.2 Formulating the Search Expression

The search for articles was done by adding relevant words to the search expression such as "PEM fuel cells", "automotive", "modelling", the words along with the logical operators(AND, OR, NOT) were added in the advanced search option available in the database. The aim was to formulate a search expression that could be used to collect a list of articles which would then be further analyzed. The search was done in sequential manner, first a broad set of search results were achieved and then the specific sub domain was singled out by adding more and more words to the search expression to further narrow our search.

The initial keywords used in the search expression were "PEM fuel cells" AND "automotive" AND "modelling" which gave an initial list of publications, in order to further focus the results which contain the words associated with auxiliary components we added more relevant words. Keywords such as "peripheral components", "auxiliary components", "humidifiers", "compressors" and "sensors" with an OR operator made sure that we include all the articles with the given search terms. The search terms also were added with an capital letters and similar words such as "PEMFC", "modelling" and "modeling" however it was found that that the search engine provides both results regardless of the minor changes in search expressions. The 'All Fields' expression indicates that the database search was conducted on all the searchable fields inside the article such as topic, author, title, etc. The final search expression that provided the best set of results is given in Table2.1 below,

Search Expression
("automotive" OR "engine" OR "vehicle"(All Fields))
AND
("modelling" OR "modeling" OR "model"(All Fields))
AND
("PEMFC"OR "PEM fuel cell" OR "proton-exchange membrane fuel cells
"OR "Hydrogen fuel cell"(All Fields))
AND
("systems" OR "system" OR "auxiliary component" OR "auxiliary com-
ponents" OR "peripheral components" OR "air supply system" OR "com-
pressors" OR "compressor" OR "Sensor" OR "sensors" OR "humidifiers"
OR "humidifier" OR "pressure regulator" OR "controller "(All Fields))

 Table 2.1: Final Search Expression

#### 2.3 Outcome

The search was conducted in May 2022 hence the results include articles published before the given date. The initial key words yielded a total number of 865 publications, these publications however contained a huge number of articles which were not related to the intended search area, we also had to reduce these results to a practical number of publications which could then be further analyzed. A total of 571 published articles were found to be associated with the final search expression which is given in Table 2.1. After adding a filter to reduce the scope further to the most recent articles published from 2018 to 2022, a total of 293 publications were obtained. These publications were used for quantitative analysis, this further helped in choosing the articles for qualitative analysis.

## **3** Quantitative Analysis

Quantitative Analysis is a technique where analysis is done based on numerical figures rather than reason or logic. In our paper we analyse different aspects such as yearly distribution of articles, top publishers, top journals, etc. The data is helpful in knowing when and where most of the research is originating and being published.

#### 3.1 Year-wise Distribution of articles

The number of articles published every year is plotted in Figure 3.1, we observe that around 35 articles were published in 2018, 46 articles were published in 2019, 91 articles were published in 2020, 89 articles were published in 2021 and around 32 were published until May 2022. The figure shows the upward trend in the number of articles published every year indicating that research and publications in this field have been steadily rising.

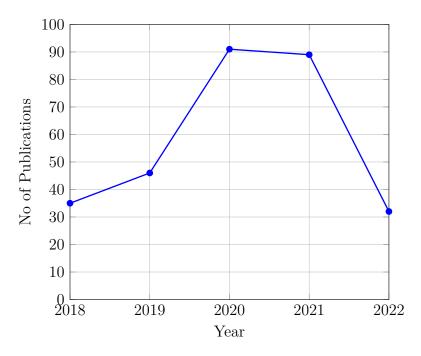


Figure 3.1: Year-wise distribution number of articles published

#### 3.2 Top Publishers

The articles were published by a total of 26 different publishers, Figure 3.2 shows the distribution of articles among the top 5 publishers. It is observed that a huge majority

of articles are published by Elsevier which has published around 190 articles, followed by Mdpi which has published around 51 articles, IEEE which has published around 14 articles, Wiley which has published around 11 articles and Taylor and Francis which has published around 7 articles.

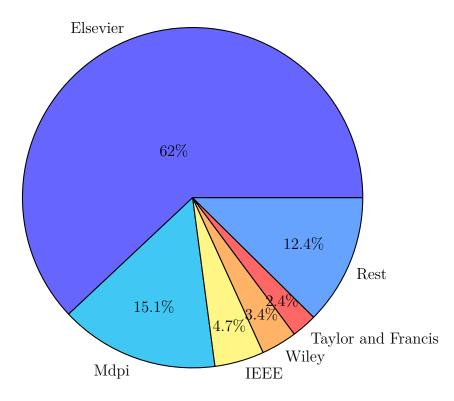


Figure 3.2: Distribution of articles by various Publishers

#### 3.3 Top Journals

The Published articles were checked for their journal titles and it was found that the articles were published under a total of 77 journal titles. Table3.1 shows the the individual number of articles published by the top journals in the field of automotive PEM Fuel cells, applied energy and hydrogen energy. The top 7 Journals contributed around 176 articles which were around 60% of published articles.

Name of the Journal	Number of published articles
International journal of hydrogen energy Energies	65 33
Energy conversion and management	26
Applied energy	19
Journal of power sources	12
Energy reports	11
Energy	10

Table 3.1: Table of journals with the number of published articles

## 3.4 Top Organizations/ Institutions

From the shortlisted articles for quantitative analysis it was found that globally around 200 institutions are publishing articles in the field of PEM Fuel cells. The top institutes are filtered with the criteria of number of publications, Table3.2 shows the top institutions and their contribution of articles. It is found that that top 10 institutions accounted for 43.8% of the articles published.

## 3.5 Country-wise distribution

Among the listed 56 countries it is observed that just 9 countries provided a significant contribution. The criteria for selecting the number of articles for each country was to look at the published articles per country, since a published article can have multiple authors from multiple countries, the figure is not a accurate representation of contributions of individual countries but shows the country of origin of the authors. The highest contribution of articles is by China having 132 articles followed by USA with 34 articles, France with 30 articles, South Korea with 21 articles, Canada with 20 articles, Iran with 18 articles, Turkey with 17 articles, England with 16 articles and Germany with 10 articles while the rest of the countries had published less than 10 articles. The distribution of the contribution of articles can be visualized effectively with the figure 3.3 shown below.

<sup>&</sup>lt;sup>1</sup>UNIVERSITY OF QUEBEC TROIS RIVIERES is a university within UNIVERSITY OF QUEBEC network which is a system of 10 provincially run universities

<sup>&</sup>lt;sup>2</sup>INSIS is a research organization within CNRS

Institutions	Number of Publi- cations
Centre National De La Recherche Scientifique (CNRS)	23
Universite De Technologie De Belfort Montbeliard(UTBM)	20
Tongji University	17
Tsinghua University	15
Chungnam National University	9
Islamic Azad University	9
Udice French Research Universities	9
University Of Quebec	9
University Of Quebec Trois Rivieres $^{1}$	9
CNRS Institute For Engineering Systems Sciences (INSIS) $^2$	8

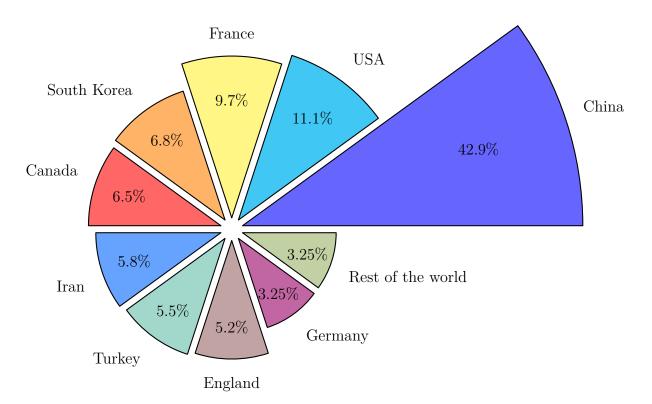


Figure 3.3: Polar Area Chart showing the distribution of articles among countries

## 3.6 Top Authors

A total of 200 authors have published articles in the field of PEM Fuel cell modeling. The criteria to select the top authors was the number of publications, since the field of PEM Fuel cell modeling is diverse the number of citations per article is very low. The list of authors with more than 6 publications is given below in Table3.3.

Author	No of Articles	Affiliation
Boulon, Loic	9	University of Quebec Trois Rivieres
Tu, Zhengkai	7	Huazhong University of Science & Tech- nology
Djerdir, Abdesslem	7	Universite de Technologie de Belfort- Montbeliard (UTBM)
Laghrouche, Salah	6	Universite de Technologie de Belfort- Montbeliard (UTBM)
Zhang, Caizhi	6	Chongqing University
Kandidayeni, Mohsen	6	University of Quebec Trois Rivieres

Table 3.3: Top Authors

## 3.7 Active Research Groups

The list of active research groups were identified by considering the most recent articles published by a group of authors from the list of countries and institutes that had significant contribution to PEMFC research, these were identified while doing the analysis of top institutions and countrywise distribution. Given below is a list of top research groups and their Group leaders/ Researchers.

#### Short Summary of research groups

- 1. CEA which is the French Alternative Energies and Atomic Energy Commission is a research lab that participates is collaborative research along with research bodies, local authorities and universities. CEA is focused on two applications which is energy transport and storage. More information can be found at this link.
- 2. SHARPAC is a research team working on Hybrid electric systems, electric actuators, fuel cell systems under the institute "Franche-Comté Electronics Mechanics Thermal Science and Optics Sciences and Technologies" (FEMTO-ST) which is a joint research institute under four universities.

Research Group/ Organization	Group Leaders/ Researchers
Commissariat à l'énergie atomique et aux énergies alternatives(CEA)	Sebastien Rosini
SHARPAC	Daniel Hissel
Energy Conversion System laboratory	Sangseok Yu, Jaeyoung Han
Institute for Hydrogen Research (IHR)	Sousso Kelouwani
Clean Energy Automotive Engineering Center (CEAEC)	
State Key Laboratory of Automotive Safety and Energy	Minggao Ouyang

#### Table 3.4: Research Groups

- 3. Energy Conversion System laboratory is a research team headed by Professor Sangseok Yu under the department of mechanical engineering of Chungnam National University. The institute conducts research in dynamic modeling of fuel cells, HILS based control strategy and many other topics that can be found on their website.
- 4. Institute for Hydrogen Research (IHR) is a research institute under Université du Québec à Trois-Rivières (UQTR), the institute is involved in fundamental as well as applied research. There are many groups working in the field of hydrogen production, storage, delivery, infrastructure as well as fuel cells.
- 5. CEAEC is a R&D center under the Tongji University, it has 5 R&D departments with one of them involved in Fuel Cell Systems. The researchers from this institute have published over 28 articles collaborating with different research institutes.
- 6. State Key Laboratory of Automotive Safety and Energy is a research institute under the Tsinghua University. The researchers working at this institute have published a significant amount of articles by collaborating with different international research institutes.

## 4 Qualitative Analysis

Qualitative analysis is a technique where data is gathered regarding a topic for research and analysed with words, attributes and properties rather than numbers. In our paper we select a list of articles and qualitatively analyse them based on a quality criteria as described below, the aim is to identify articles with the latest modelling techniques with well justified models.

#### 4.1 Articles selected for Qualitative Analysis

The list of articles published by the top institutions was taken and a select list of articles which were found to be interesting were shortlisted for qualitative analysis, Table below lists the selected articles for the review.

Articles	Description
Performance analysis of PEM fuel cell in mobile application under real traffic and en- vironmental conditions(Chen, Laghrouche, and Djerdir 2021)	Study on PEMFC performance under real traffic and environmental conditions with the help of semi empirical voltage model
Prognostic methods for proton exchange membrane fuel cell under automotive load cycling: a review(Jacome et al. 2020)	Study on the degradation mechanisms caused by Automotive load cycling and prognostics method review for automotive PEMFC's
Real time adaptive efficient cold start strat- egy for proton exchange membrane fuel cells(Amamou et al. 2018)	Proposal of a novel adaptive strategy for the cold start of PEMFC to control its internal current in real time
Numerical Study on Humidification Per- formance of Fuel Cell Test Platform Hu- midifier(T. Ma, K. Wang, et al. 2019)	Developing a numerical model of the hu- midifier and verification of its performance under the influence of various operating conditions
Research on Control Algorithm of Proton Exchange Membrane Fuel Cell Cooling Sys- tem(T. Ma, Lin, et al. 2019)	Study on developing a control algorithm for cooling system on PEMFC's by develop- ing a model and validating experimentally

Table 4.1: Table of articles selected for qualitative analysis

#### 4.2 Short Review on Selected Articles

The shortlisted articles are reviewed with the criteria based on the article "Qualitative Quality: Eight "Big-Tent" Criteria for Excellent Qualitative Research" (Tracy 2010), this article presents 8 criteria for excellent qualitative research. The list of the quality criteria chosen for the short review is given below,

Criteria for quality	Various means, practices and methods through which to achieve
Worthy Topic	The topic is relevant, significant and interesting
Rich Rigor	The study uses appropriate and complex theoretical con- structs, data, analysis processes
Credibility	The research is marked by thick description, concrete detail
Resonance	The research influences readers through transferable findings
Significant contribution	The research provides significant contribution practically, methodically and heuristically
Meaningful Coherence	The study achieves what it purports to be about and mean- ingfully interconnects literature, research and findings.

Table 4.2: Criteria for qualitative research(Tracy 2010)

The articles will also be reviewed based on the criteria of mathematical rigor, language/writing style, figure quality, formulas quality. The qualitative analysis of the above articles is given below.

# Performance analysis of PEM fuel cell in mobile application under real traffic and environmental conditions(Chen, Laghrouche, and Djerdir 2021)

The article studies the effect of PEM fuel cells of an automotive vehicle(mail delivery van) under real traffic and environmental conditions, the topic of research is relevant and significant to our study, the article was published in 2021 and hence the findings are recent. The article provides a detailed explanation of the historical and current methods and models used to study PEMFC performance, Performance degradation and Remaining useful life. The article also has detailed description of processes, the article details the different modelling methods available in literature and lists out the advantages and disadvantages and then explains the best modelling technique that can be used and hence also fulfills the criteria of credibility. The findings of the research will also be helpful for further research and hence the knowledge is transferable. This article contributes significantly towards research of fuel cell performance in the automotive domain, since

the study is conducted in real life conditions there is a huge contribution in practical research. The article also fulfills the last criteria of meaningful coherence since the research interconnects the theoretical and practical aspects of fuel cell modelling, the findings of practical experiments prove that the theoretical research and modelling is accurate.

This article has the model described in mathematical formulae, the writing style is simple and understandable, the figure quality is average however it provides the necessary information, the labels on the axis have poor formatting, the formula quality is good. Overall this article fulfills the quality criteria listed above.

# Prognostic methods for proton exchange membrane fuel cell under automotive load cycling: a review(Jacome et al. 2020)

The article studies the durability of automotive PEMFC's under automotive load cycling(ALO), since the fuel cells used in vehicles undergo ALO this topic is highly relevant in understanding the degradation effects over PEM Fuel cells. This article was published in 2020 and is relatively recent. The article has a detailed description of all the operational conditions of a automotive PEMFC and the degradation that it undergoes with references to literature, it also lists out the prognostic methods which essentially is a model based approach to predict the failure of the fuel cells hence the criteria of credibility is fulfilled. The findings of the research will be helpful in further research as the article points out some challenges that need to be worked upon. The article has significant contribution towards understanding the different prognostic methods used and their limitations and it also fulfills the last criteria of achieving the objective of the research.

This article is a review paper and hence has no mathematical formulae, the language is simple and the writing style is good with appropriate citations, the figures quality is good and informative. There are no formulae in the article. Overall the article fulfills the quality criteria listed above, but the article does not contain any fuel cell model or any mathematical description and simulation of the same.

# Real time adaptive efficient cold start strategy for proton exchange membrane fuel cells(Amamou et al. 2018)

The article proposes a novel strategy to cold start a PEMFC and control the current of the fuel cell in real time to maximize the heat flux. Cold start is a practical problem that needs to be addressed and this article tries to develop a strategy and experimentally validate the proposed technique. This fulfills the criteria of relevancy, however this paper was published in 2018 which is not very recent. The article introduces the different techniques that were proposed in literature such as potentiostatic and galvanostatic solutions and their shortcomings which are that these techniques are unable to adapt to degradation and changing operating conditions, and hence the article proposes a new technique to overcome

the shortcomings. The proposed solution has a experimentally confirmed improvement of 50% over the existing methods and hence has significant contribution towards the understanding of Fuel cell start up, the findings of this research also contribute towards further theoretical and practical research in the field.

The article describes the model using mathematical formulae, the language and writing style is good, the figure quality is decent with relevant information but they lack detail and sharpness, the quality of the formulae is also good. The article fulfills the quality criteria as listed above.

#### Numerical Study on Humidification Performance of Fuel Cell Test Platform Humidifier(T. Ma, K. Wang, et al. 2019)

The article studies the performance of a humidifier in a Fuel cell test platform by means of a numerical simulation. For the efficient performance of PEMFC the efficient working of its auxiliary components such as air supply, humidifier, etc is necessary, in this study various operating conditions are varied and the performance of the humidifier is checked. The article is relevant for our study and is published in 2019. The article has detailed explanation of the various techniques for humidification from literature however it does not have detailed descriptions of the models that were used. A mathematical model of the humidifier is developed and a numerical simulation is performed and the performance is verified, the test experimentally verifies that the designed humidifier is able to fulfil the requirements. The article contributes towards further research and development of humidifiers and there is further opportunity to experimentally validate the results of the simulation.

This article has a detailed description of the model using mathematical formulae, the writing style is simple and understandable, the plot quality is good and provides the relevant information, the quality of the formulae is good but the detail in some of the figures is not great. This article does not feature a practical experiment to verify the results of the simulation like the other articles. Overall this articles also fulfills the quality criteria.

# Research on Control Algorithm of Proton Exchange Membrane Fuel Cell Cooling System(T. Ma, Lin, et al. 2019)

The article proposes a control algorithm for the cooling system to have accurate control over temperature during dynamic load conditions. The algorithm is then tested virtually on a model and then experimentally validated. The article is relevant to our study of PEMFC's and its auxiliary components, sufficient literature research has been cited explaining the previous control strategies. The paper was published in 2019 and is relatively recent. The results show that the proposed strategy is able to control the temperature of the fuel cell under dynamic load conditions. This article fulfills the criteria of significant contribution and meaningful coherence. This findings of this research helps in further development and research of fuel cell cooling strategies and improves the understanding of fuel cells.

The article has detailed description of the model with mathematical formulae, the writing style is good and understandable and the plots provide the necessary information, the quality of plots is good but it has less detail and sharpness. This article completely fulfills the quality criteria listed above.

### 4.3 Nomenclature of Models

The articles from 2018 to 2022 were analyzed and the types of PEMFC models as described in the articles were studied. The aim was to understand the types of models used, the nomenclature used to describe the models and to study their evolution in the 5 year period. Table describes the nomenclature of different models for automotive PEMFC and its auxiliary components from 2018 to 2022. This can be helpful in understanding the naming convention used by different authors over a period of time, the table also provides an overview of the research being done on modeling of various elements of PEM fuel cells and its auxiliary components.

Models in 2018	Models in 2019	Models in 2020	Models in 2021	Models in 2022
Discrete state machine	Steady State Thermody-	Zero Dimensional Steady	Thermodynamic	Air Supply system
Model(Roda et al. 2018)	namic Model(Li et al. 2019)	state Thermodynamic	Model(Sun, Peng, and	Model(D. Zhao et al.
		Model(Biberci and Celik	Zhu 2021)	2022)
		2020)		
High Fidelity	Thermal Resistance Net-	1 Dimensional Match	2nd Order Affine oriented	Air compressor dynamic
Model(Piffard et al.	work Model(Sulaiman,	Model(Jin et al. $2021$ )	Control Model(Tang et al.	Model(D. Zhao et al. 2022)
2018)	Singh, and Mohamed 2019)		2021)	
Probabilistic Simulation	Local controlled Au-	Macroscopic 1D+1D	Electrochemical and dy-	Semi-empirical and quasi
Model(Tuominen et al.	al. toregressive integrated	Model(Grimm et al. 2020)	namic Model(Z. Wang, Yi,	static Model(Luciani and
2018)	Model(D. Yang et al. 2019)		and S. Zhang 2021)	Tonoli 2022)
Power System Model(R.	Source to Range	Modular and Parametric	Dynamic Detailed	Dynamic energetic
Ma et al. 2018)	Model(Xiong et al. 2019)	Model(D'Ovidio, Ometto,	Model(Gomez, Serra,	Model(Fabri et al. 2022)
		and Villante 2020)	and Husar 2021)	
Dynamic vehicle model in-	Neural Network	Reduced Order nonlinear	Numerical Model(Ahsan et	Fuel cell engine mechanism
tegrated with the fuel cell	Model(AbouOmar, HJ.	Model(Goshtasbi and Ersal	al. $2021$ )	model(Huo et al. 2022)
system model(J. Han and	Zhang, and Su 2019,C.	2020)		
S. Yu 2018)	Guo et al. 2019, Chen,			
	Laghrouche, and Djerdir			
	2019,D. Yu et al. 2019)			
iscale Model(Xu et al.	Multiscale Model(Xu et al. Agglomerate Model(J. Han,	3D computational	Fault Diagnosis Model(Zuo	Semi Empirical - semi
2018)	Hwang, and S. Yu 2019)	Model(Gong et al. 2020)	et al. 2021)	mechanism Model(Jia et al.
				2022)
			-	

et al. 2018) 2019) 1D and 3D Model(Q. Numerical Zhang, Xu, et al. 2018) et al. 2019) et al. 2019)	Simulation Ma, K. Wang,			
l(Q.	Simulation Ma, K. Wang,		``````````````````````````````````````	dynamics model(B. Zhao et al. 2022)
	K. Wang,	Neural Network	3D computational fluid dy-	Semi-empirical and quasi-
et al. 2		Model(Vichard et al.	namic Model & 2D tran-	static model (Luciani and
		2020)	scient Model(Lingchao et al.	Tonoli 2022)
			2022)	
2D multiphysics Two	Phase Dynamic	Black Box	Temperature control	
Model(Mayur et al. Model(	Model(Kang, L. Zhao, and	model(ANN's)(Tsakyridis	Model(Hu et al. 2021)	
2018) Brouwe	Brouwer 2019)	et al. 2020)		
2 Phase Fuel Stack Finite	Finite Time Thermody-	Parameterized Stack	3D Steady State radiator	
$Model(Xu et al. 2018) \qquad namic N$	namic Model(Li et al. 2019)	Model(Yiping Wang et al.	model(Luo et al. 2022)	
		2020)		
Hybrid System Model(Lu   Validated	ated Emperical	Periodic Unit Model(Q.	Framework	
et al. 2018, R. Ma et al. Model(	Model(Yongqiang Wang	Zhang, Tong, et al. 2020)	Model()Ahluwalia et	
2018, Y. Han et al. 2018) et al. 2019)	2019)		al. 2021	
Three Dimensional and Combined	ined System	Optimized Support Vector	FC electrochemical	
isothermal anode relative Model(	Model(Liu et al. 2018)	machine Model(F. Han et	model(Kravos et al.	
humidity Model(Liu et al.		al. 2020)	2021)	
2018)				
		Transcient	3D multiphysics	
		Model/Framework	Model(Nefedkin et al.	
		model/MS Excel	2021)	
		model(Brooks et al.		
		2020)		

SemiempericalRHNN Model(Rotor Hop- field Neural Network)(M.Model(Murugesanandfield Neural Network)(M.Subramaniam 2020)Yang et al. 2021)Economical-functionalEconomical-functionalGFPF-RHNNbasedModel(H. Guo et al. 2020)Model(M. Yang et al.Model(H. Guo et al. 2020)2021)	SemiempericalRHNN Model(RotorModel(Murugesanandfield Neural NetworSubramaniam 2020)Yang et al. 2021)Yang et al. 2021)Economical-functionalGFPF-RHNN1Model(H. Guo et al. 2020)Model(M. Yang e2021)2021)2021)
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Table 4.3: Nomenclature of fuel cell models from 2018 to 2022

### **5** Summary and Conclusion

In this paper we perform a literature survey on PEM Fuel cell modelling, WoS database was used to gather articles by formulating a search expression, the study was performed on articles published from 2018 to June 2022, the results of the literature survey are summarized below.

WoS database was used to find the articles for the literature survey. A search expression was formulated in order to aggregate the relevant articles to our topic. The filter function was used to filter the articles from 2018 to 2022 to obtain the most recent articles and carry out further quantitative analysis. The search expression that is formulated can be used in the future to obtain articles about fuel cell modeling in automotive vehicles.

The year wise distribution of articles showed a upward trend, indicating growing interest in the field of PEM fuel cell modeling and its peripheral components. The country-wise distribution of articles shows that a majority of the research originates from a few countries like China, USA, France, South Korea, Canada, Iran, Turkey, England and Germany. The distribution of articles among the publishers shows that 75% of the articles are published among Elsevier and Mdpi with other publishers having less than 5% of the articles.

Around 200 institutions globally published articles related to the topic however around 43.8% of the research was published by the top 10 institutes. Many research groups were identified that published results in the field of PEM fuel cell modeling. The top authors of the articles were also identified among a total of 200 authors.

Qualitative analysis was done on a select list of papers which were identified and the review was done based on the quality criteria and it was found that most of the articles fulfilled the criteria. Analysis of of the nomenclature of models was done to understand the trends in fuel cell modeling, the table containing the year wise trend in fuel cell modeling shows the diversity of models that are published in the field.

From this literature survey we can conclude that significant research is being done in the field of Fuel cell modeling and modeling of its auxiliary components in automotive vehicles, and the trends show that this is an active as well as a growing field. There is good scope for future experimental as well as practical research which is indicated by the qualitative analysis of the articles. The Search expression that was formulated and the list of research groups can help as a foundation for future research.

## literature

- Cheddie, Denver and Norman Munroe (2005). "Review and comparison of approaches to proton exchange membrane fuel cell modeling". In: *Journal of Power Sources* 147.1, pp. 72– 84. ISSN: 0378-7753. DOI: https://doi.org/10.1016/j.jpowsour.2005.01.003. URL: https://www.sciencedirect.com/science/article/pii/S0378775305000765.
- Sopian, Kamaruzzaman and Wan Ramli Wan Daud (2006). "Challenges and future developments in proton exchange membrane fuel cells". In: *Renewable Energy* 31.5. SOUTH/SOUTH, pp. 719-727. ISSN: 0960-1481. DOI: https://doi.org/10.1016/j. renene.2005.09.003. URL: https://www.sciencedirect.com/science/article/ pii/S0960148105002454.
- Tracy, Sarah (Oct. 2010). "Qualitative Quality: Eight "Big-Tent" Criteria for Excellent Qualitative Research". In: *Qualitative Inquiry* 16, pp. 837–851. DOI: 10.1177/1077800410383121.
- Daud, W.R.W. et al. (2017). "PEM fuel cell system control: A review". In: Renewable Energy 113, pp. 620-638. ISSN: 0960-1481. DOI: https://doi.org/10.1016/j.renene. 2017.06.027. URL: https://www.sciencedirect.com/science/article/pii/ S0960148117305281.
- Secanell, M. et al. (2017). "PEM Fuel Cells, Modeling". In: *Encyclopedia of Sustainability Science and Technology*. Ed. by Robert A. Meyers. New York, NY: Springer New York, pp. 1–61. ISBN: 978-1-4939-2493-6. DOI: 10.1007/978-1-4939-2493-6\_1019-1. URL: https://doi.org/10.1007/978-1-4939-2493-6\_1019-1.
- Amamou, A. et al. (Apr. 2018). "Real time adaptive efficient cold start strategy for proton exchange membrane fuel cells". In: APPLIED ENERGY 216, pp. 21–30. ISSN: 0306-2619. DOI: 10.1016/j.apenergy.2018.02.071.
- Han, Jaeyoung and Sangseok Yu (Sept. 2018). "Ram air compensation analysis of fuel cell vehicle cooling system under driving modes". In: APPLIED THERMAL ENGINEERING 142, pp. 530–542. ISSN: 1359-4311. DOI: 10.1016/j.applthermaleng.2018.07.038.
- Han, Ying et al. (Jan. 2018). "Multisource Coordination Energy Management Strategy Based on SOC Consensus for a PEMFC-Battery-Supercapacitor Hybrid Tramway". In: *IEEE TRANSACTIONS ON VEHICULAR TECHNOLOGY* 67.1, pp. 296–305. ISSN: 0018-9545. DOI: 10.1109/TVT.2017.2747135.
- Liu, Yongfeng et al. (Nov. 2018). "Asymptotic Analysis for the Effects of Anode Inlet Humidity on the Fastest Power Attenuation Single Cell in a Vehicle Fuel Cell Stack". In: APPLIED SCIENCES-BASEL 8.11. DOI: 10.3390/app8112307.

- Lu, Xueqin et al. (Sept. 2018). "A comprehensive review on hybrid power system for PEMFC-HEV: Issues and strategies". In: ENERGY CONVERSION AND MANAGE-MENT 171, pp. 1273–1291. ISSN: 0196-8904. DOI: 10.1016/j.enconman.2018.06.065.
- Ma, Rui et al. (Oct. 2018). "CPU-FPGA based real-time simulation of fuel cell electric vehicle". In: *ENERGY CONVERSION AND MANAGEMENT* 174, pp. 983–997. ISSN: 0196-8904. DOI: 10.1016/j.enconman.2018.08.099.
- Mayur, Manik et al. (Aug. 2018). "Lifetime Prediction of a Polymer Electrolyte MembraneFuel Cell under Automotive Load Cycling Using a Physically-Based Catalyst DegradationModel". In: *ENERGIES* 11.8. ISSN: 1996-1073. DOI: 10.3390/en11082054.
- Murschenhofer, Dominik et al. (Apr. 2018). "A real-time capable quasi-2D proton exchange membrane fuel cell model". In: ENERGY CONVERSION AND MANAGEMENT 162, pp. 159–175. ISSN: 0196-8904. DOI: 10.1016/j.enconman.2018.02.028.
- Piffard, Maxime et al. (June 2018). "Sliding mode observer for proton exchange membrane fuel cell: automotive application". In: JOURNAL OF POWER SOURCES 388, pp. 71–77. ISSN: 0378-7753. DOI: 10.1016/j.jpowsour.2018.03.057.
- Roda, Vicente et al. (Aug. 2018). "Remodeling of a commercial plug-in battery electric vehicle to a hybrid configuration with a PEM fuel cell". In: *INTERNATIONAL JOURNAL OF HYDROGEN ENERGY* 43.35, SI. 6th Symposium on Hydrogen, Fuel Cells and Advanced Batteries (HYCELTEC), Porto, PORTUGAL, JUN 19-23, 2017, pp. 16959–16970. ISSN: 0360-3199. DOI: 10.1016/j.ijhydene.2017.12.171.
- Tuominen, R. et al. (Mar. 2018). "Probabilistic risk model for assessing hydrogen fuel contamination effects in automotive FC systems". In: *INTERNATIONAL JOURNAL OF HYDROGEN ENERGY* 43.9, pp. 4143–4159. ISSN: 0360-3199. DOI: 10.1016/j. ijhydene.2017.12.158.
- Xu, Liangfei et al. (Aug. 2018). "Interactions between a polymer electrolyte membrane fuel cell and boost converter utilizing a multiscale model". In: *JOURNAL OF POWER* SOURCES 395, pp. 237–250. ISSN: 0378-7753. DOI: 10.1016/j.jpowsour.2018.05.065.
- Zhang, Qinguo, Liangfei Xu, et al. (Jan. 2018). "Performance prediction of proton exchange membrane fuel cell engine thermal management system using ID and 3D integrating numerical simulation". In: *INTERNATIONAL JOURNAL OF HYDROGEN ENERGY* 43.3, pp. 1736–1748. ISSN: 0360-3199. DOI: 10.1016/j.ijhydene.2017.10.088.
- AbouOmar, Mahmoud S., Hua-Jun Zhang, and Yi-Xin Su (Apr. 2019). "Fractional Order Fuzzy PID Control of Automotive PEM Fuel Cell Air Feed System Using Neural Network Optimization Algorithm". In: *ENERGIES* 12.8. DOI: 10.3390/en12081435.
- Chen, Kui, Salah Laghrouche, and Abdesslem Djerdir (Sept. 2019). "Degradation prediction of proton exchange membrane fuel cell based on grey neural network model and particle swarm optimization". In: *ENERGY CONVERSION AND MANAGEMENT* 195, pp. 810–818. ISSN: 0196-8904. DOI: 10.1016/j.enconman.2019.05.045.

- Cruz-Rojas, A. et al. (Jan. 2019). "SIMULATION AND CONTROL OF REACTANTS SUPPLY AND REGULATION OF AIR TEMPERATURE IN A PEM FUEL CELLS SYSTEM WITH CAPACITY OF 50 KW". In: *REVISTA MEXICANA DE INGE-NIERIA QUIMICA* 18.1, pp. 349-360. ISSN: 1665-2738. DOI: 10.24275/uam/izt/dcbi/ revmexingquim/2019v18n1/Martinez.
- Guo, Chengjun et al. (Mar. 2019). "Optimization of critical parameters of PEM fuel cell using TLBO-DE based on Elman neural network". In: *ENERGY CONVERSION AND MANAGEMENT* 183, pp. 149–158. ISSN: 0196-8904. DOI: 10.1016/j.enconman.2018. 12.088.
- Han, Jaeyoung, Janghwan Hwang, and Sangseok Yu (May 2019). "A simulation of automotive fuel cell system for oxygen starvation trends by compressor surge under load follow-up". In: APPLIED THERMAL ENGINEERING 154, pp. 251-262. ISSN: 1359-4311. DOI: 10.1016/j.applthermaleng.2019.03.073.
- Kang, Sanggyu, Li Zhao, and Jacob Brouwer (Dec. 2019). "Dynamic modeling and verification of a proton exchange membrane fuel cell-battery hybrid system to power servers in data centers". In: *RENEWABLE ENERGY* 143, pp. 313–327. ISSN: 0960-1481. DOI: 10.1016/j.renene.2019.04.150.
- Li, Changjie et al. (July 2019). "Finite Time Thermodynamic Optimization of an Irreversible Proton Exchange Membrane Fuel Cell for Vehicle Use". In: *PROCESSES* 7.7. DOI: 10.3390/pr7070419.
- Ma, Tiancai, Weikang Lin, et al. (Oct. 2019). "Research on Control Algorithm of Proton Exchange Membrane Fuel Cell Cooling System". In: *ENERGIES* 12.19. DOI: 10.3390/en12193692.
- Ma, Tiancai, Kai Wang, et al. (Oct. 2019). "Numerical Study on Humidification Performance of Fuel Cell Test Platform Humidifier". In: *ENERGIES* 12.20. DOI: 10.3390/en12203839.
- Sulaiman, M. Saufi, B. Singh, and W. A. N. W. Mohamed (July 2019). "Experimental and theoretical study of thermoelectric generator waste heat recovery model for an ultra-low temperature PEM fuel cell powered vehicle". In: *ENERGY* 179, pp. 628–646. ISSN: 0360-5442. DOI: 10.1016/j.energy.2019.05.022.
- Wang, Yongqiang et al. (Mar. 2019). "Power management system for a fuel cell/battery hybrid vehicle incorporating fuel cell and battery degradation". In: *INTERNATIONAL JOURNAL OF HYDROGEN ENERGY* 44.16, pp. 8479–8492. ISSN: 0360-3199. DOI: 10.1016/j.ijhydene.2019.02.003.
- Xiong, Huiyuan et al. (Nov. 2019). "An energy matching method for battery electric vehicle and hydrogen fuel cell vehicle based on source energy consumption rate". In: *INTERNATIONAL JOURNAL OF HYDROGEN ENERGY* 44.56, pp. 29733-29742. ISSN: 0360-3199. DOI: 10.1016/j.ijhydene.2019.02.169.

- Yang, Duo et al. (Dec. 2019). "Modeling and control of PEMFC air supply system based on T-S fuzzy theory and predictive control". In: *ENERGY* 188. ISSN: 0360-5442. DOI: 10.1016/j.energy.2019.116078.
- Yu, Dongmin et al. (Nov. 2019). "System identification of PEM fuel cells using an improved Elman neural network and a new hybrid optimization algorithm". In: *ENERGY REPORTS* 5, pp. 1365–1374. ISSN: 2352-4847. DOI: 10.1016/j.egyr.2019.09.039.
- Ao, Yunjin et al. (Nov. 2020). "Lifetime prediction for proton exchange membrane fuel cell under real driving cycles based on platinum particle dissolve model". In: *INTER-NATIONAL JOURNAL OF HYDROGEN ENERGY* 45.56, pp. 32388–32401. ISSN: 0360-3199. DOI: 10.1016/j.ijhydene.2020.08.188.
- Biberci, Mehmet Ali and Mustafa Bahattin Celik (June 2020). "Dynamic Modeling and Simulation of a PEM Fuel Cell (PEMFC) during an Automotive Vehicle's Driving Cycle". In: ENGINEERING TECHNOLOGY & APPLIED SCIENCE RESEARCH 10.3, pp. 5796–5802. ISSN: 2241-4487.
- Brooks, Kriston P. et al. (Sept. 2020). "Design tool for estimating metal hydride storage system characteristics for light-duty hydrogen fuel cell vehicles". In: *INTERNATIONAL JOURNAL OF HYDROGEN ENERGY* 45.46, pp. 24917–24927. ISSN: 0360-3199. DOI: 10.1016/j.ijhydene.2020.05.159.
- D'Ovidio, Gino, Antonio Ometto, and Carlo Villante (June 2020). "A Novel Optimal Power Control for a City Transit Hybrid Bus Equipped with a Partitioned Hydrogen Fuel Cell Stack". In: *ENERGIES* 13.11. DOI: 10.3390/en13112682.
- Gong, Chengyuan et al. (Aug. 2020). "Heat dissipation characteristic in the intake grille and radiator of a fuel cell vehicle". In: *INTERNATIONAL JOURNAL OF GREEN ENERGY* 17.10, pp. 591–601. ISSN: 1543-5075. DOI: 10.1080/15435075.2020.1779078.
- Goshtasbi, Alireza and Tulga Ersal (May 2020). "Degradation-conscious control for enhanced lifetime of automotive polymer electrolyte membrane fuel cells". In: *JOURNAL* OF POWER SOURCES 457. ISSN: 0378-7753. DOI: 10.1016/j.jpowsour.2020.227996.
- Grimm, M. et al. (Aug. 2020). "Water Management of PEM Fuel Cell Systems Based on the Humidity Distribution in the Anode Gas Channels". In: *FUEL CELLS* 20.4, SI, pp. 477–486. ISSN: 1615-6846. DOI: 10.1002/fuce.202000070.
- Guo, Haibing et al. (Nov. 2020). "Optimized parameter estimation of a PEMFC model based on improved Grass Fibrous Root Optimization Algorithm". In: *ENERGY REPORTS* 6, pp. 1510–1519. ISSN: 2352-4847. DOI: 10.1016/j.egyr.2020.06.001.
- Han, Feng et al. (May 2020). "Research on the Fault Diagnosis of a Polymer Electrolyte Membrane Fuel Cell System". In: *ENERGIES* 13.10. DOI: 10.3390/en13102531.
- Jacome, Andres et al. (Dec. 2020). "Prognostic methods for proton exchange membrane fuel cell under automotive load cycling: a review". In: *IET ELECTRICAL SYSTEMS IN TRANSPORTATION* 10.4, SI. 16th IEEE Vehicle Power and Propulsion Conference

(VPPC), Hanoi, VIETNAM, OCT 14-17, 2019, pp. 369-375. ISSN: 2042-9738. DOI: 10.1049/iet-est.2020.0045.

- Murugesan, Karthik and Usha Subramaniam (Mar. 2020). "Characterization and experimental validation of a semi-empirical fuel cell model for investigating the water dynamics on the electrical behavior of a 5 kW Ballard stack system using Nafion 117 polymer membrane". In: JOURNAL OF RENEWABLE AND SUSTAINABLE ENERGY 12.2. ISSN: 1941-7012. DOI: 10.1063/1.5121609.
- Tsakyridis, Georgios et al. (June 2020). "Design and Control of a DC Boost Converter for Fuel-Cell-Powered Marine Vehicles". In: JOURNAL OF MARINE SCIENCE AND APPLICATION 19.2, pp. 246–265. ISSN: 1671-9433. DOI: 10.1007/s11804-020-00140-8.
- Vichard, L. et al. (May 2020). "Degradation prediction of PEM fuel cell based on artificial intelligence". In: INTERNATIONAL JOURNAL OF HYDROGEN ENERGY 45.29, pp. 14953–14963. ISSN: 0360-3199. DOI: 10.1016/j.ijhydene.2020.03.209.
- Wang, Yiping et al. (June 2020). "Thermal Management System Modeling and Simulation of a Full-Powered Fuel Cell Vehicle". In: JOURNAL OF ENERGY RESOURCES TECHNOLOGY-TRANSACTIONS OF THE ASME 142.6. ISSN: 0195-0738. DOI: 10. 1115/1.4045479.
- Zhang, Qinguo, Zheming Tong, et al. (Nov. 2020). "Research on low-temperature heat exchange performance of hydrogen preheating system for PEMFC engine". In: *INTER-NATIONAL JOURNAL OF HYDROGEN ENERGY* 45.55, pp. 30966–30979. ISSN: 0360-3199. DOI: 10.1016/j.ijhydene.2020.08.076.
- Ahluwalia, R. K. et al. (Apr. 2021). "Achieving 5,000-h and 8,000-h Low-PGM Electrode Durability on Automotive Drive Cycles". In: JOURNAL OF THE ELECTROCHEMI-CAL SOCIETY 168.4. ISSN: 0013-4651. DOI: 10.1149/1945-7111/abf507.
- Ahsan, Nabeel et al. (Nov. 2021). "Performance analysis of hydrogen fuel cell with two-stage turbo compressor for automotive applications". In: *ENERGY REPORTS* 7, pp. 2635–2646. ISSN: 2352-4847. DOI: 10.1016/j.egyr.2021.05.007.
- Chen, Kui, Salah Laghrouche, and Abdesslem Djerdir (Jan. 2021). "Performance analysis of PEM fuel cell in mobile application under real traffic and environmental conditions".
  In: ENERGY CONVERSION AND MANAGEMENT 227. ISSN: 0196-8904. DOI: 10. 1016/j.enconman.2020.113602.
- Gomez, Juan Carlos, Maria Serra, and Attila Husar (July 2021). "Controller design for polymer electrolyte membrane fuel cell systems for automotive applications". In: *INTERNATIONAL JOURNAL OF HYDROGEN ENERGY* 46.45, pp. 23263-23278. ISSN: 0360-3199. DOI: 10.1016/j.ijhydene.2021.04.136.
- Hu, Donghai et al. (Dec. 2021). "Investigation of optimal operating temperature for the PEMFC and its tracking control for energy saving in vehicle applications". In:

ENERGY CONVERSION AND MANAGEMENT 249. ISSN: 0196-8904. DOI: 10.1016/j.enconman.2021.114842.

- Jin, Jianjiao et al. (Jan. 2021). "An investigation of a high-performance centrifugal compressor with a variable map width enhancement slot for proton exchange membrane fuel cell systems in commercial vehicle application". In: PROCEEDINGS OF THE INSTI-TUTION OF MECHANICAL ENGINEERS PART D-JOURNAL OF AUTOMOBILE ENGINEERING 235.1, pp. 288–300. ISSN: 0954-4070. DOI: 10.1177/0954407020937149.
- Kravos, Andraz et al. (Apr. 2021). "Methodology for efficient parametrisation of electrochemical PEMFC model for virtual observers: Model based optimal design of experiments supported by parameter sensitivity analysis". In: *INTERNATIONAL JOUR-NAL OF HYDROGEN ENERGY* 46.26, SI, pp. 13832–13844. ISSN: 0360-3199. DOI: 10.1016/j.ijhydene.2020.10.146.
- Nefedkin, Sergey I. et al. (June 2021). "Effect of the corrugated bipolar plate design on the self-humidification of a high power density PEMFC stack for UAVs". In: *FUEL CELLS* 21.3, pp. 234–253. ISSN: 1615-6846. DOI: 10.1002/fuce.202000163.
- Ou, Mingyang et al. (Mar. 2021). "A novel approach based on semi-empirical model for degradation prediction of fuel cells". In: JOURNAL OF POWER SOURCES 488. ISSN: 0378-7753. DOI: 10.1016/j.jpowsour.2020.229435.
- Sun, Jian, Bin Peng, and Bingguo Zhu (Nov. 2021). "Performance Analysis and Test Research of PEMFC Oil-Free Positive Displacement Compressor for Vehicle". In: *EN-ERGIES* 14.21. DOI: 10.3390/en14217329.
- Tang, Xianzhi et al. (Nov. 2021). "Analysis of Optimal Oxygen Excess Ratio and Nonlinear Tracking Control of Vehicle PEMFC Air Supply System". In: MATHEMATICAL PROBLEMS IN ENGINEERING 2021. ISSN: 1024-123X. DOI: 10.1155/2021/4914816.
- Wang, Zili, Guodong Yi, and Shaoju Zhang (Oct. 2021). "An Improved Fuzzy PID Control Method Considering Hydrogen Fuel Cell Voltage-Output Characteristics for a Hydrogen Vehicle Power System". In: *ENERGIES* 14.19. DOI: 10.3390/en14196140.
- Yang, Ming et al. (Nov. 2021). "Optimal model identification of the PEMFCs using optimized Rotor Hopfield Neural Network". In: *ENERGY REPORTS* 7, pp. 3655–3663. ISSN: 2352-4847. DOI: 10.1016/j.egyr.2021.06.052.
- Zuo, Bin et al. (Jan. 2021). "Data-driven flooding fault diagnosis method for protonexchange membrane fuel cells using deep learning technologies". In: *ENERGY CON-VERSION AND MANAGEMENT* 251. ISSN: 0196-8904. DOI: 10.1016/j.enconman. 2021.115004.
- Fabri, Giuseppe et al. (May 2022). "A Battery-Free Sustainable Powertrain Solution for Hydrogen Fuel Cell City Transit Bus Application". In: SUSTAINABILITY 14.9. DOI: 10.3390/su14095401.

- Huo, Weiwei et al. (Mar. 2022). "Research on Fuel Cell Fault Diagnosis Based on Genetic Algorithm Optimization of Support Vector Machine". In: *ENERGIES* 15.6. DOI: 10. 3390/en15062294.
- Jia, Yuru et al. (Mar. 2022). "Research on Temperature Control of Fuel-Cell Cooling System Based on Variable Domain Fuzzy PID". In: *PROCESSES* 10.3. DOI: 10.3390/pr10030534.
- Lingchao, Xia et al. (May 2022). "Numerical study of vapor behavior in high temperature PEM fuel cell under key material and operating parameters". In: *INTERNATIONAL JOURNAL OF GREEN ENERGY* 19.7, pp. 707–718. ISSN: 1543-5075. DOI: 10.1080/15435075.2021.1960354.
- Luciani, Sara and Andrea Tonoli (Mar. 2022). "Control Strategy Assessment for Improving PEM Fuel Cell System Efficiency in Fuel Cell Hybrid Vehicles". In: *ENERGIES* 15.6. DOI: 10.3390/en15062004.
- Luo, Wei et al. (Jan. 2022). "Novel structural designs of fin-tube heat exchanger for PEMFC systems based on wavy-louvered fin and vortex generator by a 3D model in OpenFOAM". In: *INTERNATIONAL JOURNAL OF HYDROGEN ENERGY* 47.3, pp. 1820–1832. ISSN: 0360-3199. DOI: 10.1016/j.ijhydene.2021.10.093.
- Zhao, Bin et al. (2022). "Investigation of 3D Transient Flow and Discharge Pressure Pulsation of Helical Roots Air Compressor for Hydrogen Fuel Cell Vehicle". In: *PRO-CEEDINGS OF THE INSTITUTION OF MECHANICAL ENGINEERS PART C-JOURNAL OF MECHANICAL ENGINEERING SCIENCE*. ISSN: 0954-4062. DOI: 10.1177/09544062221111257.
- Zhao, Dongdong et al. (Feb. 2022). "Design and control of air supply system for PEMFC UAV based on dynamic decoupling strategy". In: ENERGY CONVERSION AND MANAGEMENT 253. ISSN: 0196-8904. DOI: 10.1016/j.enconman.2021.115159.