Multi-view Stacked CNN-BiLSTM (MvS CNN-BiLSTM) for urban PM2.5 concentration prediction of India's polluted cities



Thesis submitted in partial fulfilment for the Award of

DOCTOR OF PHILOSOPHY

in

Subject

By

SUBHAM KUMAR

Under the supervision of

NAME OF Supervisor

Department of Computer Science and Information Technology School of Computational Sciences, Information and Communication Technology

MAHATMA GANDHI CENTRAL UNIVERSITY

Motihari, East Champaran, Bihar-845401

Jan,2025

MGCU2021CSIT4029

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Jan,2025

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I, Name of Scholar certify that the work embodied in this Ph.D. thesis is my own bonafide work carried out by me under the supervision of NAME OF Supervisor and the cosupervision of NAME OF Co-Supervisor for a period of 4 Years from 2nd jan 2025 to 10th jan 2025 at Mahatma Gandhi Central University and (Name of the Institution where work has been carried out partly or fully). The matter embodied in this Ph.D. thesis has not been submitted for the award of any other degree/diploma.

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CNN-BiLSTM) for urban $PM2.5$ concentration prediction of India's polluted cities
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Philosophy in to be awarded by Mahatma Gandhi Central University,
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Abstract

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Acknowledgment

This M.Tech **ReportType** is the result of hard work, upon which many people have contributed and given their support. I have made this dissertation on the topic "**ReportTitel**." I have also tried my best in this dissertation to explain all the related detail. I would like to express my sincere gratitude towards my Superviser **Supervisor**, Department of **Department**, for providing excellent guidance, encouragement, inspiration, and constant and timely support throughout this **Degree** dissertation work. He taught me how to pursue the right aim towards the work, and showed me differnt ways to approach the research problem. His wide knowledge and logical ways of thinking have been great value for me, and his understanding and guidance have provided the successful completion of the Dissertation work.

First and foremost, I would like to express my gratitude to our beloved Dean of the Computational Sciences, Information and Communication Technology and Head of Department of Computer Science and Information Technology **HodName**, for providing his kind support in various aspects. A special thanks to all the Respected Teachers of the Department of Computer Science and Information Technology.

I am always grateful to the university, our Hon'ble Vice chancellor **Vc** for providing such a good research environment.

Special thanks to Ph.D scholar, especially Ritika Singh, Surbhi Kumari, Ibrahim Momin, Naushad Ahmad and my friends Tej Prakash, Gajendra Patel, Abhijeet Kumar, Amod Kumar, Rana Kumar, Krishna Murari, Rajan Kumar, Suraj, Md. Aamir Sohail, Shahzeb Khan, and all my lovely juniors for their invaluable feedbacks, care, and moral support during this endeavor.

Mother and **Father**, it is impossible to thanks adequately for everything you have done, from loving me unconditionally to rising me in a stable household, where your persistent efforts and traditional values taught your children to celebrate and embrace life. I could not have asked for better parents or role-models. You showed me that anything is possible with faith, hard work and determination.

Name of Scholar MGCU2021CSIT4029 Degree(CSE)



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List of Abbreviations

USA United States of America

List of Symbols

F force

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Introduction

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1.1 Introduction

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Paragraph2

Paragraph3

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1.1.1 pm2

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Literature Review

2.1 Literature Review

Paragraph

Paragraph

Table 9.1 REFRENCE OF TABLE

Table 2.1: Summarizing of Related work to pridict $PM_{2.5}$

Paper	Proposed Model Data Source		Forecasting	Benchmark Models Results	Results
			nafan		
:	:	:	:	:	:

Basics Related Roncepts

- 3.1 Basics Related Roncepts
- 3.1.1 Machine Learning

Paragraph

Methodology

4.1 Methodology

Table 4.1: 17 Indian cities dataset, with start and end dates and sample counts.

DataSets	Fast_Day	Last_Day	No of Samples
BHIWADI	20-12-2017	02-12-2022	43394
	15:00	16:00	
JODHPUR	01-12-2015	02-12-2022	61409
	00:00	16:00	
SINGRAULI	08-12-2017	03-12-2022	43695
	11:00	01:00	
ANKLESHWAR	04-02-2019	03-12-2022	33535
	18:00	00:00	
LUDHIANA	01-05-2017	03-12-2022	49010
	00:00	01:00	
DURGAPUR	06-12-2020	03-12-2022	17434
	15:00	00:00	
YAMUNA_NAGAR	03-01-2019	02-12-2022	34299
	14:00	16:00	
CHARKHI_DADRI	03-03-2020	02-12-2022	24099
	15:00	17:00	
JIND	10-01-2019	03-12-2022	34145
	09:00	01:00	
KURUKSHETRA	07-01-2019	03-12-2022	34208
	18:00	01:00	
SONIPAT	01-01-2019	02-12-2022	34362
	00:00	17:00	
DHARUHERA	04-01-2019	02-12-2022	34265
	12:00	04:00	
AMBALA	08-01-2019	02-12-2022	34174
	12:00	09:00	
HISAR	10-01-2019	03-12-2022	34143
	10:00	00:00	
FATEHABAD	09-01-2019	02-12-2022	34160

Table 11.1:

Results and Analysis

5.1 Results and Analysis

Table 5.1: All Datasets RMSE.

DataSets	BiLS-	CNN	GRU	Seq2-	'	%	CNN	CNN	GRU_
	TM			Seq	LSTM	LSTM	Bi-	LSTM	Bi-
							LSTM		LSTM
BHIWADI	23.13	57.2	22.34	24.2	19.6	48.14	45.98	43.5	35.3
JODHPUR	27.54	26.68	32.94	22.35	22.08	50	40.87	43.55	52.63
SINGRAULI	10.92	15.5	27.34	21.61	13.63	17.79	50.61	22.2	26.5
ANKLESHWAR	18.53	16.68	37.15	23.78	18.38	46.28	62.85	68.72	69.38
LUDHIANA	8.4	11.12	22.14	10.1	8.3	21.15	25.66	24.76	23.77
DURGAPUR	6.14	8.27	20.34	9.48	8.78	15.28	9.62	13.76	24.39
YAMUNA_NAGAR	37.34	34.57	56.27	36.33	38.18	66.14	72.39	45.63	74.13
CHARKHI_DADRI	18.42	20.43	27.96	18.43	18.06	40.71	46.16	45.27	43.48
JIND	24.17	26.42	34.35	25.85	19.41	79.22	62.13	43.59	50.95
KURUKSHETRA	27.14	72.03	43.56	27.32	26.7	65.77	39.71	88.12	53.74
SONIPAT	12.56	15.98	22.4	15.41	10.9	43.02	24.01	22.96	46.77
DHARUHERA	26.74	28.93	34.6	24.06	25.19	53.18	31.93	35.01	46.22

AMBALA	22.58	28.96	41.08	19.92	16.92	57.43	40.71	34.14	63.85
HISAR	28.34	62.99	47.93	33.98	30.99	63.29	43.16	49.1	62.46
FATEHABAD	14.37	38.36	72.71	15.51	15.58	38.38	74.38	76.75	72.64
BULANDSHAHR	7.39 8.87	8.87	19.79	11.19 7.2	7.2	14.98 9.61		13.16 11.51	11.51
MUZAFFARNAGAR	11.88	16.13	11.88 16.13 13.72 14.2		12.75 22.21		15.91 23.6		21.9

Table 5.2: Average Rankings of RMSE by (N*N) Friedman Test

Algorithm	Ranking
BiLSTM	2.1176
CNN	4.2941
GRU	5.7059
Seq2Seq	3.1176
V-LSTM	1.7059
S-LSTM	7.1176
CNN-BiLSTM	6.5294
CNN-LSTM	6.9412
GRU-BiLSTM	7.4706



Figure 5.1: Actual vs Predicted of BiLSTM for All Datasets

Conclusion

6.1 Conclusion

Introduction

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7.1 Introduction

Paragraph1 SDSDS DJBKJFH DHOIUHFOIS SJKHFKS Drewil and Al-Bahadili

(2022)

Paragraph2

Paragraph3

7.1.1 pm2

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7.1.1.1 pm2

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Results and Analysis

8.1 Results and Analysis

Table 8.1: All Datasets RMSE.

DataSets	BiLS-	CNN	GRU	Seq2-	'	\forall \dots	CNN	CNN	GRU_
	TM			Seq	LSTM	LSTM	Bi-	LSTM	Bi-
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FATEHABAD	14.37	14.37 38.36 72.71 15.51 15.58 38.38 74.38 76.75 72.64	72.71	15.51	15.58	38.38	74.38	76.75	72.64
BULANDSHAHR	7.39	8.87	19.79	19.79 11.19 7.2	7.2	14.98 9.61	9.61	13.16 11.51	11.51
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CNN-LSTM	6.9412
GRU-BiLSTM	7.4706



Figure 8.1: Actual vs Predicted of BiLSTM for All Datasets

Literature Review

9.1 Literature Review

Paragraph

Paragraph

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Paper	Proposed Model Data Source	Data Source	Forecasting	Benchmark Models Results	Results
			Object		
:	:	:	:	:	:

Basics Related Roncepts

- **10.1** Basics Related Roncepts
- 10.1.1 Machine Learning

Paragraph

Methodology

11.1 Methodology

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YAMUNA_NAGAR	03-01-2019	02-12-2022	34299
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CHARKHI_DADRI	03-03-2020	02-12-2022	24099
	15:00	17:00	
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KURUKSHETRA	07-01-2019	03-12-2022	34208
	18:00	01:00	
SONIPAT	01-01-2019	02-12-2022	34362
	00:00	17:00	
DHARUHERA	04-01-2019	02-12-2022	34265
	12:00	04:00	
AMBALA	08-01-2019	02-12-2022	34174
	12:00	09:00	
HISAR	10-01-2019	03-12-2022	34143
	10:00	00:00	
FATEHABAD	09-01-2019	02-12-2022	34160

Table 11.1:

Conclusion

12.1 Conclusion

References

Ghufran Isam Drewil and Riyadh Jabbar Al-Bahadili. Air pollution prediction using 1stm deep learning and metaheuristics algorithms. Measurement: Sensors, 24: 100546, 2022.

Appendices

Chapter A

Supporting Information



Figure A.1: Caption of image 2.

Chapter B

Supporting Information



Figure B.1: Caption of image 2.

List of Publications and Presentations

Refereed Journals/Manuscripts Under Preparation

1. A. Autohr, and B. Author. Article title, *Journal Name*, year, vol., xxxx–xxxx.

Book

1. A. Autohr, *Book title*, Under preparation.

Conference Abstracts/Posters/Presentations

- 1. A. Autohr, B. Author, and C.D. Author, Title of the talk/poster, *Conference Name*, Place, Country, day month year.
- 2. A. Autohr, B. Author, and C.D. Author, Title of the talk/poster, *Conference Name*, Place, Country, day month year.