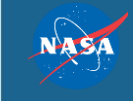


HEALTH & AIR QUALITY

EARTH SCIENCE
APPLIED SCIENCES

Enhancing air quality decision-making activity in Indian megacities through assimilation of NASA Earth observations and development of a decision support system

Rajesh Kumar
23 April 2024



Project Partners/Collaborators



EARTH SCIENCE
APPLIED SCIENCES

| Role | Name | Affiliation | Organization Type |
|--------------|--------------------|-------------|-------------------------|
| Co-I | John Schreck | NSF NCAR | FFRDC |
| Co-I | Gabriele Pfister | NSF NCAR | FFRDC |
| Co-I | David Edwards | NSF NCAR | FFRDC |
| Co-I | Scott Meech | NSF NCAR | FFRDC |
| Collaborator | Sachin Ghude | IITM | Government organization |
| Collaborator | Vijay Soni | IMD | Government organization |
| Collaborator | Helen Worden | NSF NCAR | FFRDC |
| Collaborator | Alexander Baklanov | WMO | United Nations |
| Collaborator | Prafull Yadav | IITM | Government organization |
| Collaborator | Gaurav Govardhan | IITM | Government organization |
| Collaborator | Rajmal Jat | IITM | Government organization |

NSF NCAR: National Science Foundation (NSF) National Center for Atmospheric Research (NCAR);

IITM: Indian Institute of Tropical Meteorology

IMD: India Meteorological Department; WMO: World Meteorological Organization



Enhancing air quality decision-making activity in India

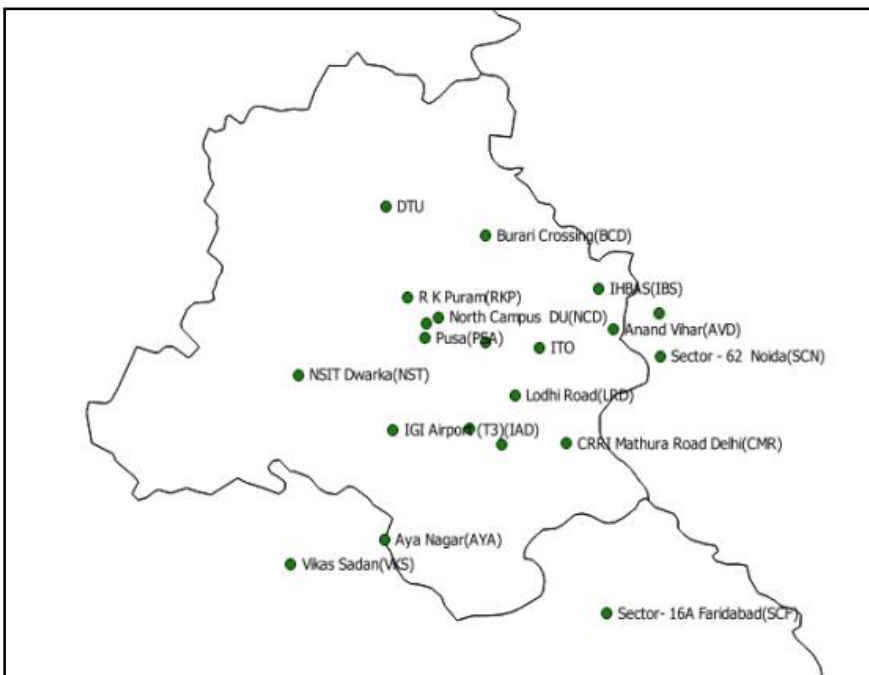
E-mail: rkumar@ucar.edu

Air Pollution has become a severe issue in New Delhi

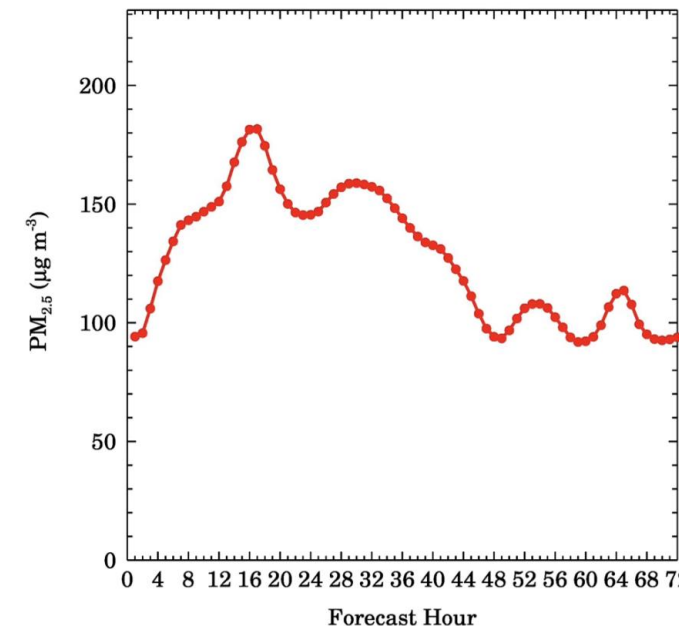
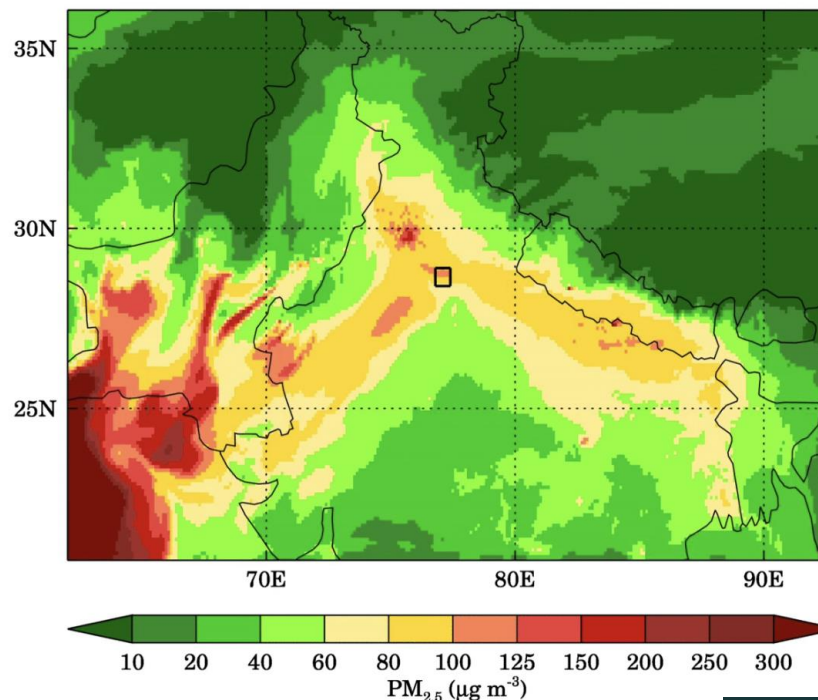
- Indian medical association declared a public health emergency and called conditions equivalent to smoking 50 cigarettes a day.
- Delhi Chief Minister called the city a “Gas-chamber”!
- Maximum PM_{2.5} concentration on 08 Nov 2017 reached 1500 µg/m³. WHO air quality guideline for 24-h average is 15 µg/m³.
- A person on an average loses ~6.5 years of their life due to exposure to air pollution in Delhi.

Government (Ministry of Earth Sciences), India Initiatives

Air Quality Monitoring Network (Delhi-NCR)



Air Quality Forecasts



Information Dissemination:

- Digital boards
- SMS
- Mobile Apps
- Websites



National Clean Air Programme

India national level target of reducing 20-30%

Earth Observations, Models, and/or Technologies

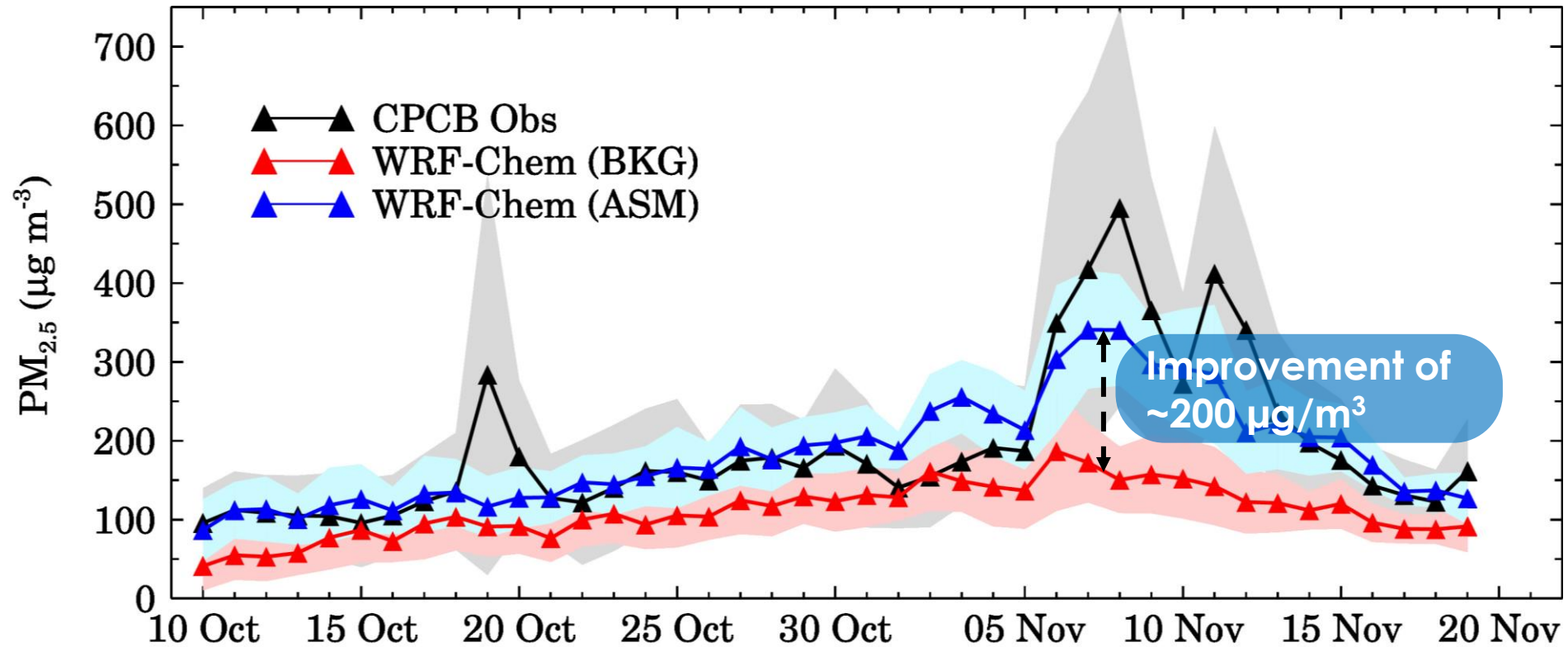
| Satellite Sensor/Model/Tech. | Product Used | Temporal Coverage and Latency required | Comments |
|------------------------------|-------------------------|--|---|
| MODIS Terra | NRT Level 2 AOD | Daily, latency: 3-hours | Currently assimilated |
| MODIS Aqua | NRT Level 2 AOD | Daily, latency: 3-hours | Currently assimilated |
| VIIRS | NRT Level 2 AOD | Daily, latency: 6-hours | Assimilation tested |
| TROPOMI | NRT Level 2 CO | Daily, latency: 3-hours | To be assimilated |
| Surface observations | PM2.5 and PM10 | Hourly; latency: 1-hour | NRT evaluation and assimilation in 400 m domain |
| WRF-Chem | Air quality simulations | Daily, 72-h forecasts | Operational air quality forecasting model |

Delayed availability of VIIRS AOD retrievals can delay the forecasts!



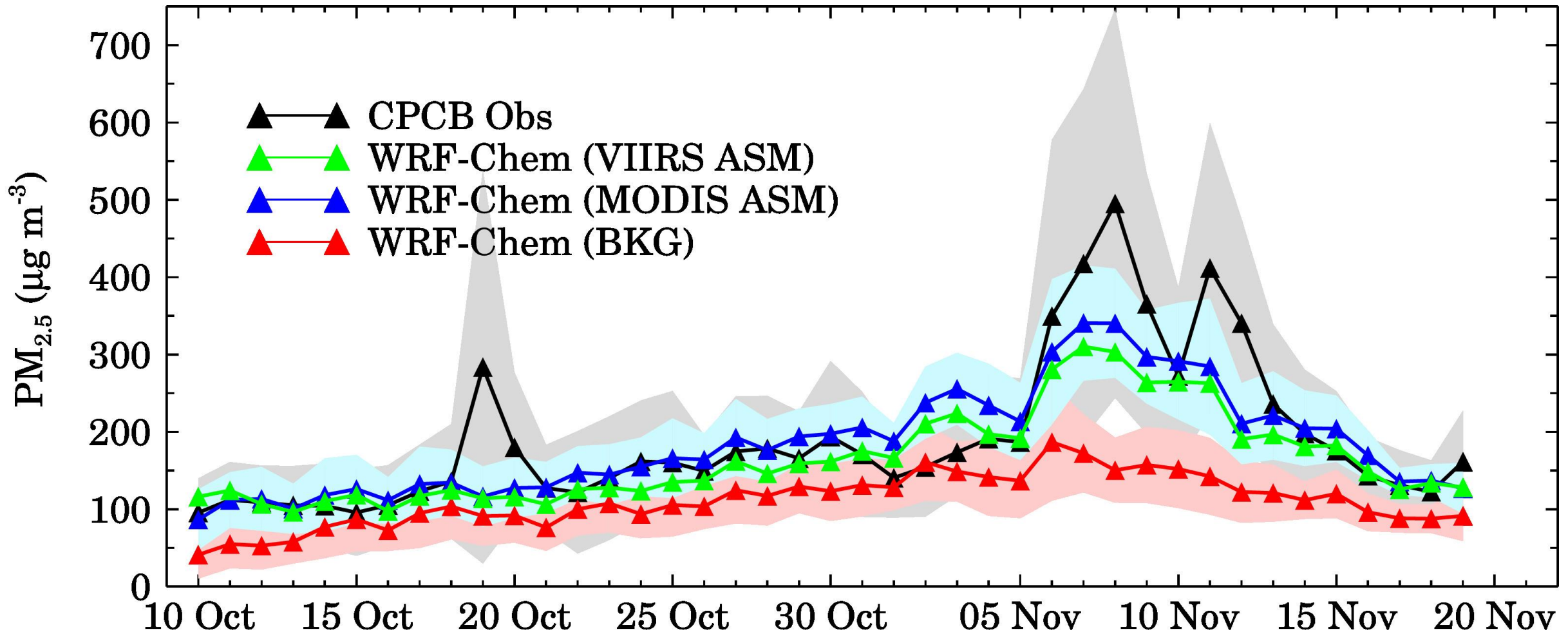
Improvements in daily average PM_{2.5} Forecasts

Daily averaged PM_{2.5} in Delhi from 10 Oct to 19 Nov 2017



Mean bias reduction over the entire period: 86% [Kumar et al., 2020]

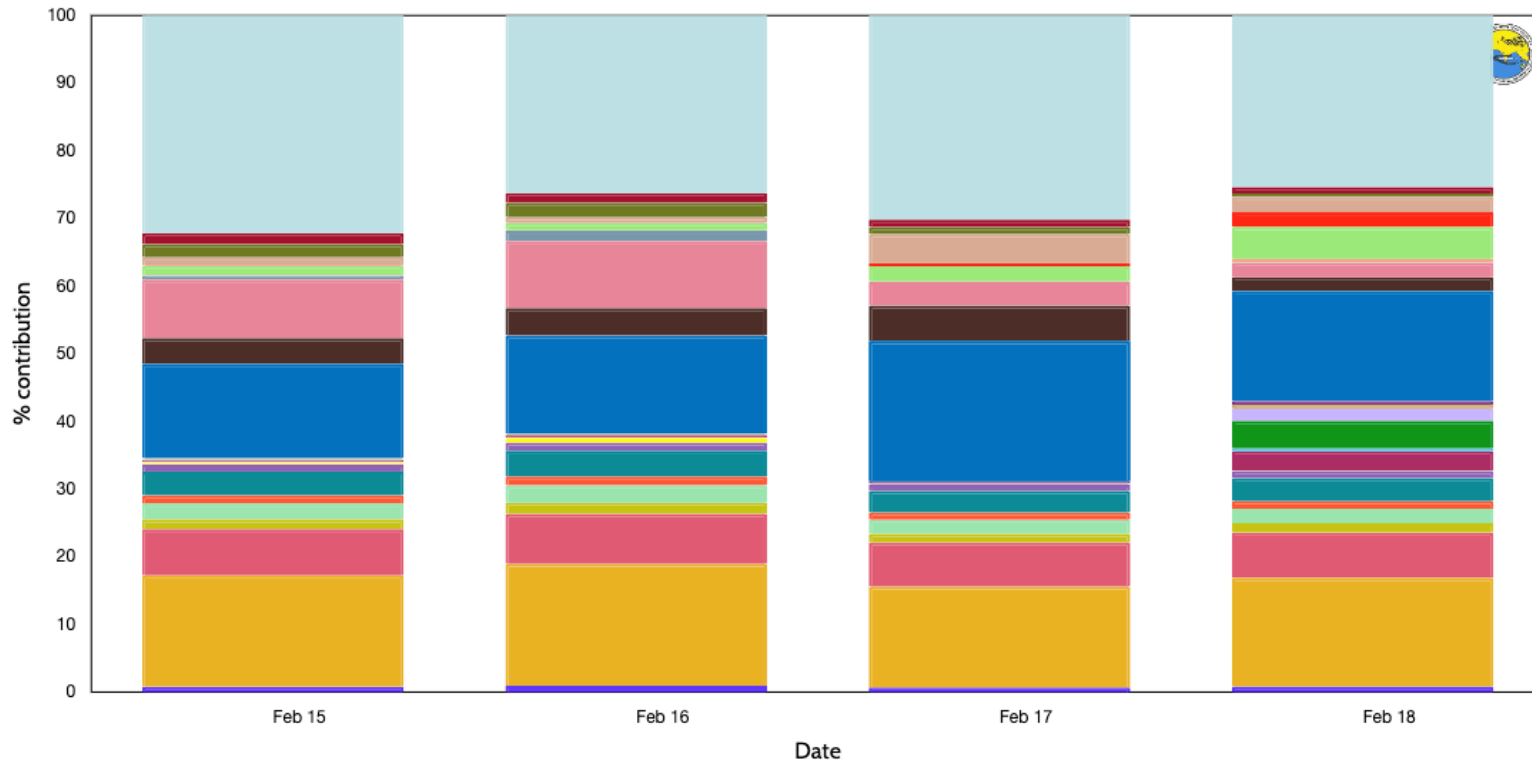
Impact of assimilating VIIRS AOD retrievals



Assimilating VIIRS AOD provides nearly the same benefit as MODIS AOD assimilation.

Prediction of source attribution information (15-18 Feb 2024)

Daily Mean of Local and Non-Local Fractional Contribution to PM_{2.5} in Delhi for the next four days



Note: Please use the checkboxes to select/deselect any particular source

- | | | | | |
|--|---|---|---|---|
| <input checked="" type="checkbox"/> Select All | <input checked="" type="checkbox"/> Delhi Energy | <input checked="" type="checkbox"/> Delhi Transport | <input checked="" type="checkbox"/> Delhi & peripheral Industries | <input checked="" type="checkbox"/> Delhi Waste burning |
| <input checked="" type="checkbox"/> Delhi Construction | <input checked="" type="checkbox"/> Delhi Road dust | <input checked="" type="checkbox"/> Delhi Residential | <input checked="" type="checkbox"/> Delhi Other sectors | <input checked="" type="checkbox"/> Karnal |
| <input checked="" type="checkbox"/> Muzaffarnagar | <input checked="" type="checkbox"/> Meerut | <input checked="" type="checkbox"/> Ghaziabad | <input checked="" type="checkbox"/> Bulandshahr | <input checked="" type="checkbox"/> Gautam Buddha Nagar |
| <input checked="" type="checkbox"/> Faridabad | <input checked="" type="checkbox"/> Bharatpur | <input checked="" type="checkbox"/> Alwar | <input checked="" type="checkbox"/> Mahendergarh | <input checked="" type="checkbox"/> Jhajjar |
| <input checked="" type="checkbox"/> Rohtak | <input checked="" type="checkbox"/> Sonipat | <input checked="" type="checkbox"/> Panipat | <input checked="" type="checkbox"/> Bagpat | <input checked="" type="checkbox"/> Gurgaon |
| <input checked="" type="checkbox"/> Rewari | <input checked="" type="checkbox"/> Bhiwani | <input checked="" type="checkbox"/> Jind | <input checked="" type="checkbox"/> Stubble Burning | <input checked="" type="checkbox"/> Others |

Predicting source attribution information was the identified decision-making at the beginning of this project.

[Govardhan et al., GMD, 2024]



Information Dissemination (<https://ews.tropmet.res.in/>)

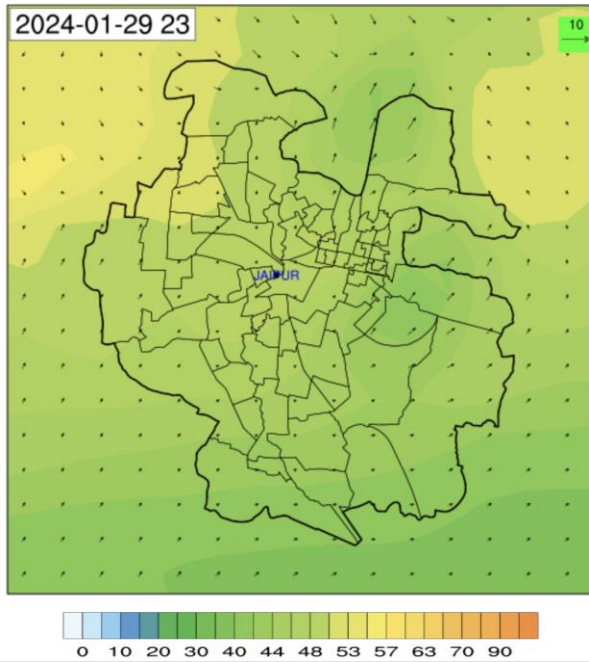
The screenshot shows the website's header with logos for ESO, IITM, and the Ministry of Earth Sciences, Government of India. The main navigation bar includes links for AIR QUALITY FORECAST, FOG FORECAST (WiFEx), ANALYSIS, DSS, HOME, ABOUT US, PEOPLE, EVENT, and CONTACT US. The content area is divided into three main sections: 'Air Quality Forecast (IST)' with a regional map, 'Delhi Air Quality Forecast' with a city map, and 'Observation' with a night photograph of the India Gate. Below these are three more sections: 'Bulletin & Message' containing a text-based air quality and weather bulletin for Delhi NCR dated 27.03.2023; 'Air Quality Index at Delhi' featuring two circular gauges showing a current AQI of 109 and a forecast AQI of 114 for 2023-03-28; and 'Air Quality Forecast Over India' with a map of India showing forecasted air quality levels.

- A new website has been developed to disseminate these air quality information (both observations and forecasts) to the public.
- This website has been launched by the Ministry of Earth Sciences.
- The website also provides information about fog forecasts.

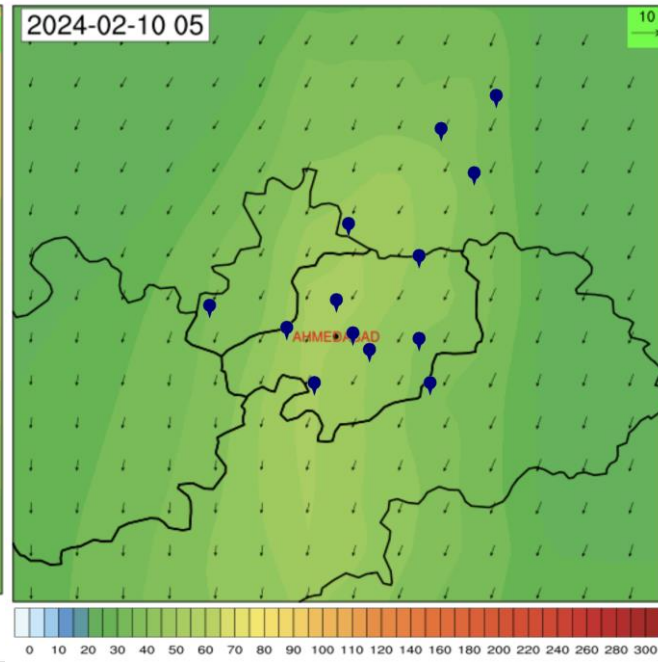
AQEWS for Mumbai, Jaipur, Pune, and Ahmedabad

- In addition to Delhi air quality forecasts, we have started providing air quality forecasts at 2 km resolution for Mumbai, Jaipur, Pune, and Ahmedabad.
- High-resolution (2 km) emission inventories developed by our end-user organization (IITM) are integrated into these forecasts. A 72-h forecast is being generated every day.

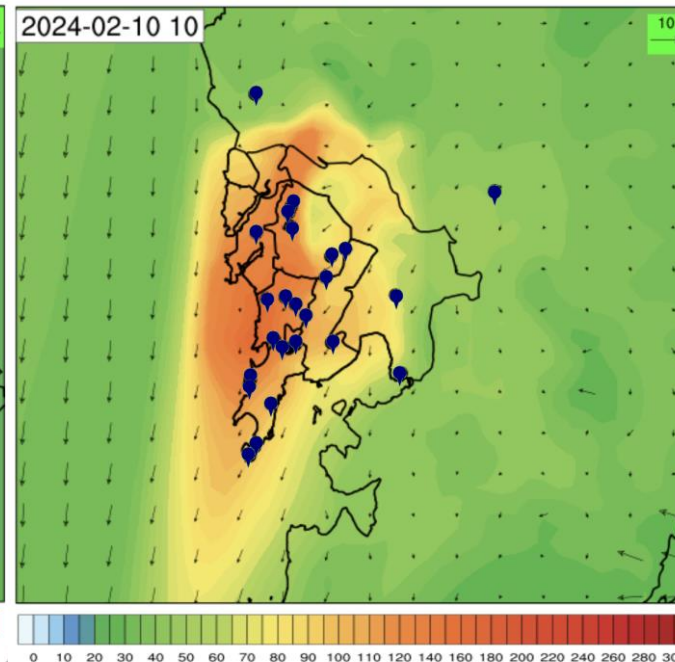
PM2.5 forecast (Jaipur)



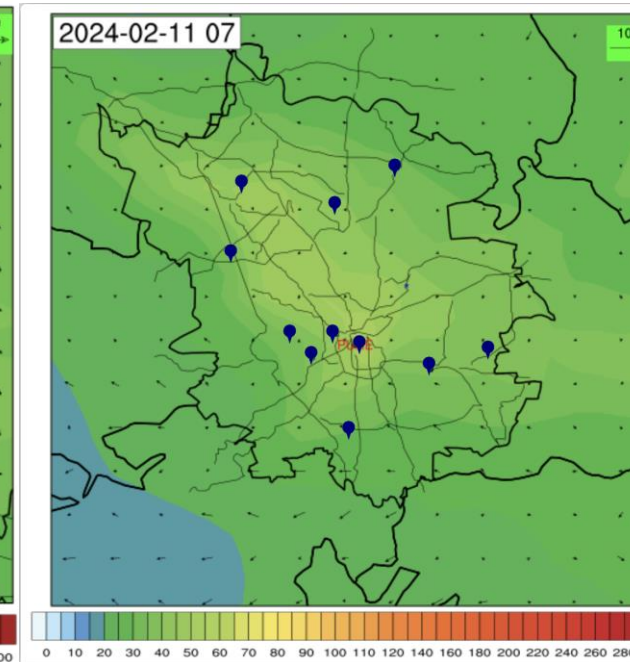
PM2.5 forecast (Ahmedabad)



PM2.5 forecast (Mumbai)



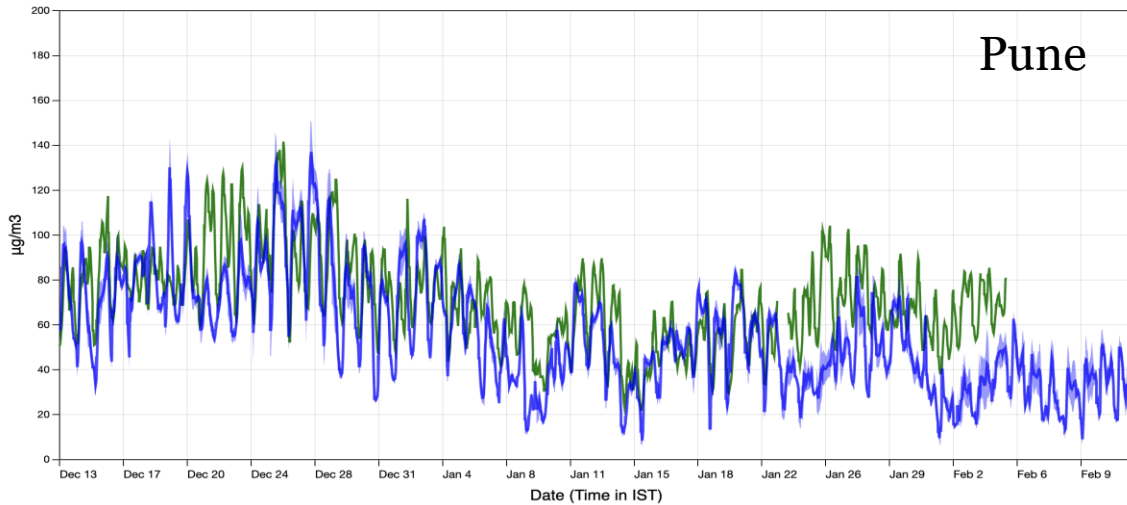
PM2.5 forecast (Pune)



Pins show the location of observation sites in each city. An observation network is being implemented in Jaipur.

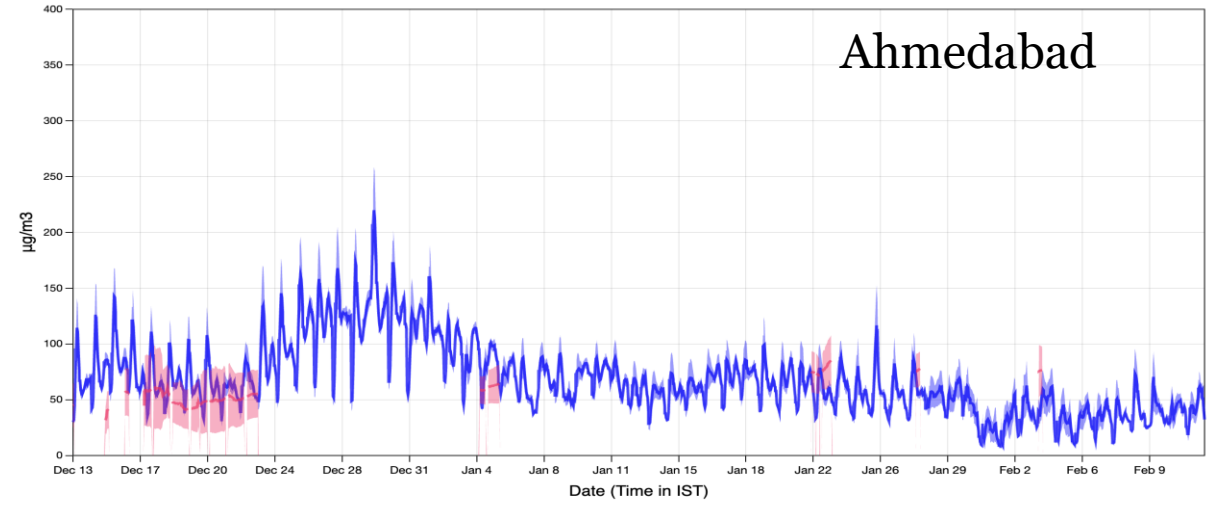
NRT evaluation in other cities

Hourly Forecast Verification PM_{2.5}



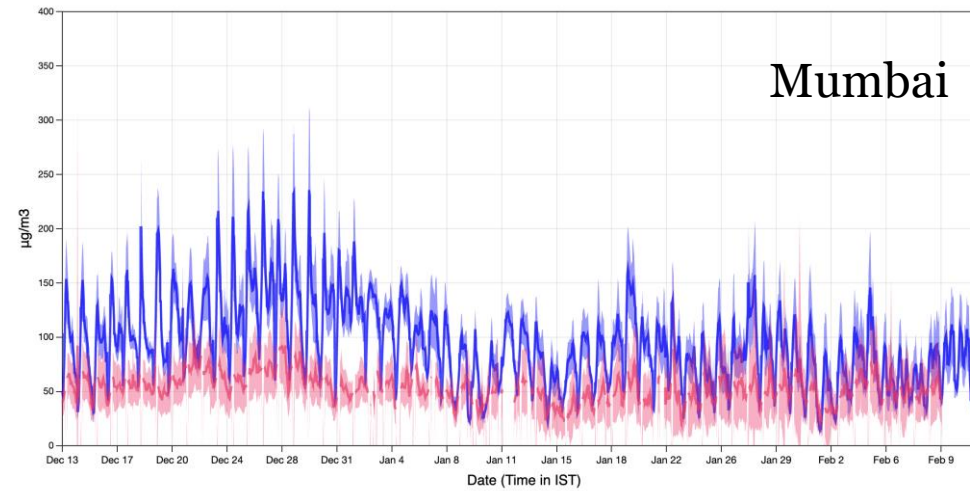
Select All Observation (Running Mean) Forecast Observation (Hourly Mean)

Hourly Forecast Verification PM_{2.5}



Select All Observation (Running Mean) Forecast Observation (Hourly Mean)

Hourly Forecast Verification PM_{2.5}



Select All Observation Forecast



Project End-users & Stakeholders

List organization names and organization types

| Organization Name | Organization Type | Decision Making Activity |
|---------------------------------------|-------------------|--|
| IITM | Government | Produces operational air quality forecasts for use by the IMD to generate air quality bulletins |
| IMD | Government | Generates air quality bulletins including information about potential emission mitigation scenarios |
| Commission for Air Quality Management | Policy-making | Uses the information from air quality forecasts to determine when to activate and enforce temporary emissions control measures |

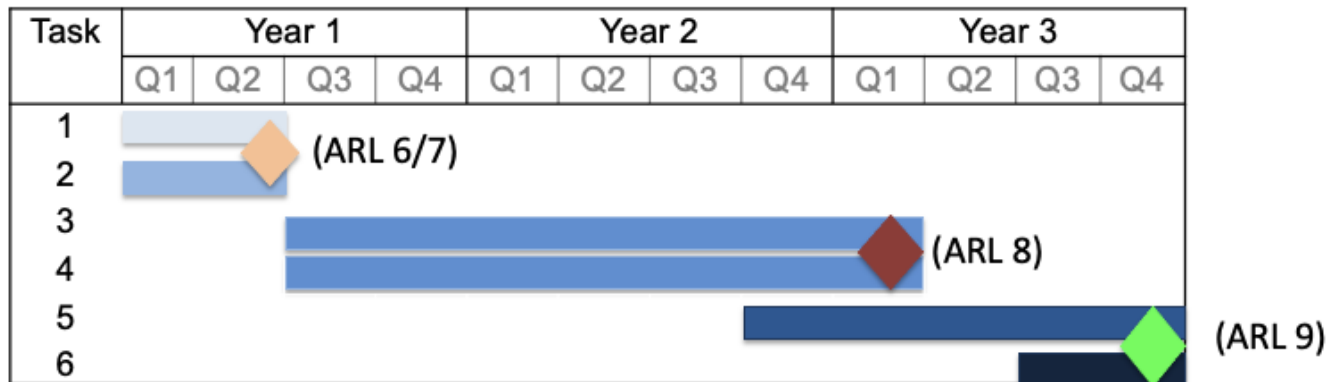
Stakeholder engagement

- I meet with IITM team every week.
- Sachin Ghude (IITM) visited NSF NCAR from 14 Feb – 10 Mar 2023 to work on our project activities.
- Prafull Yadav (IITM) will be visiting from 01 May – 01 July 2024 to transition VIIRS assimilation capability to IITM.

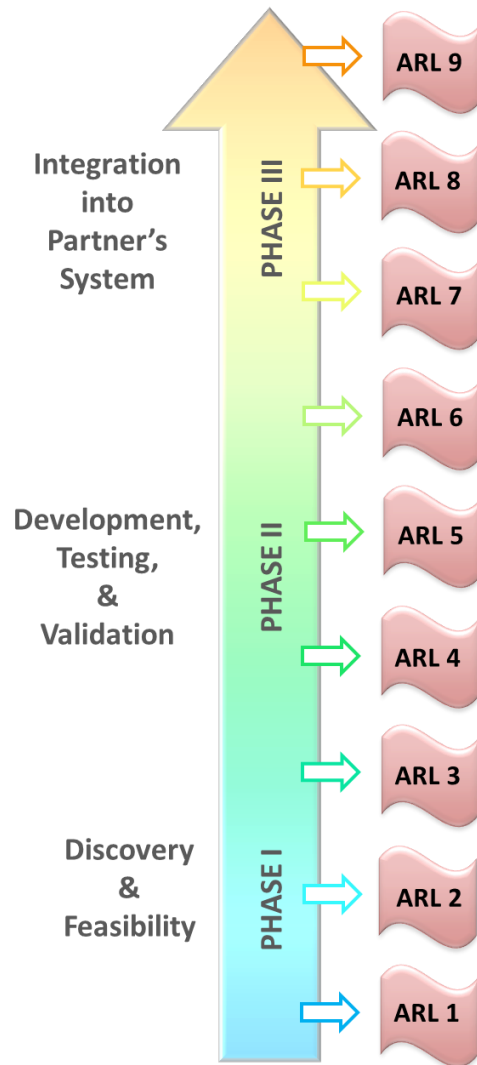


Schedule & Milestones

| Task # | Description | Status |
|--------|--|---------------|
| 1 | Set-up air quality forecasting system | Completed |
| 2 | Set-up Chemical data assimilation system | Completed |
| 3 | Developing machine learning based decision support system | Ongoing (60%) |
| 4 | Developing AQWES for urban areas of India | Completed |
| 5 | Integrating new capabilities in the information dissemination system | Ongoing (50%) |
| 6 | Transition to operations of the new air quality forecasting capabilities | Ongoing (50%) |

























ARL Performance



- Start-of-Project ARL = 6 (01 Aug 2022)
 - Delhi AQEWS has already been running in the end user's operational environment and MODIS AOD is currently being assimilation in the Delhi AQEWS.
- Goal ARL = 9
- Current ARL = 7.8 (20 Apr 2024)
 - Assimilation of MODIS AOD implemented in the redesigned operational system with monthly varying background error covariances. (ARL 9).
 - A physics-based decision support system has been implemented operationally and provided important tested in end-user's operational environment. (ARL9)
 - VIIRS AOD assimilation framework is ready now and is under testing for implementation in operations (ARL 7).
 - High-resolution emission inventories are completed and prototype operational forecasts started for Mumbai, Pune, Ahmedabad, and Jaipur. (ARL 8). With full automation in winter 2024, we will achieve ARL 9.
 - A machine-learning based decision support system is also under development (6).

Current ARL-Supporting Evidence

11 GRAP orders issued this season: <https://caqm.nic.in/index1.aspx?lsid=4168&lev=2&lid=4171&langid=1>

| | |
|---|---|
| → Order dated 27.02.2024 - Revocation of Actions under stage-I, Poor Air Quality of GRAP |   7312KB |
| → Order dated 19.02.2024 - Revocation of Actions under Stage-II Very Poor Air Quality of GRAP and intensifying actions under Stage-I of revised GRAP in Delhi - NCR |   7014KB |
| → Order dt. 18.01.2024 - Revocation of Actions under Stage-III (Severe Air Quality) of revised GRAP in Delhi-NCR - Steps to be taken |   7032KB |
| → Order dated 14.01.2024 - Implementation of Actions under Stage-III (Severe Air Quality) of revised GRAP in Delhi-NCR- Steps to be taken |   240KB |
| → Order dt 01.01.2024 - Revocation of Actions under Stage-III Severe Air Quality of revised GRAP in Delhi - NCR |   19660KB |
| → Order dated 22.12.2023 - Implementation of Actions under Stage-III Severe Air Quality of revised GRAP in Delhi-NCR |   21990KB |
| → Order dated 28.11.2023 - Revocation of Actions under stage-III (Severe Air Quality) of revised Graded Response Action plan in Delhi-NCR |   18736KB |
| → Order dated 18.11.2023 - Revocation of Actions under Stage-IV (Severe Plus Air Quality) of revised Graded Response Action Plan in Delhi-NCR |   226KB |
| → Order dated 05.11.2023 - Implementation of Actions under Stage-IV (Severe Plus Air Quality) of revised GRAP in Delhi-NCR- Steps to be taken |   7238KB |
| → Order dated 02.11.2023 - Implementation of Actions under Stage-III (Severe Air Quality) of revised GRAP in Delhi-NCR- Steps to be taken |   22576KB |
| → Order dated 21.10.2023 - Implementation of Actions under Stage-II (Very Poor Air Quality) of revised GRAP in Delhi-NCR- steps to be taken |   224KB |



Current ARL evidence: GRAP Order coverage in media

EDITION IN ▾ DELHI 31°C

THE TIMES OF INDIA

City **Delhi** Mumbai Bengaluru Hyderabad Kolkata Chennai Agra Agartala Ahmedabad Ajmer ...

CIVIC ISSUES DELHI MCD ELECTIONS CRIME POLITICS SCHOOL AND COLLEGES CITIZEN REPORTER VIDEOS PHOTOS WEATHER

NEWS / CITY NEWS / DELHI NEWS / GRAP 3 Restrictions Reimposed As Air Quality Deteriorates in Delhi-NCR

TRENDING Pune Bitcoin Scam Bihar Lok Sabha Election Voting Hubballi Campus MCA student Death

THIS STORY IS FROM JANUARY 14, 2024

GRAP 3 restrictions reimposed as air quality deteriorates in Delhi-NCR

TOI City Desk / TIMESOFINDIA.COM / Updated: Jan 14, 2024, 12:11 IST

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Image used for representational purpose only

14 Jan 2024

NEW DELHI: The Commission for Air Quality Management (CAQM) on Sunday reimposed restrictions under Stage-III of GRAP in the entire NCR with immediate effect amid worsening air quality.

EDITION IN ▾ DELHI 31°C

THE TIMES OF INDIA

City **Delhi** Mumbai Bengaluru Hyderabad Kolkata Chennai Agra Agartala Ahmedabad Ajmer ...

CIVIC ISSUES DELHI MCD ELECTIONS CRIME POLITICS SCHOOL AND COLLEGES CITIZEN REPORTER VIDEOS PHOTOS WEATHER

NEWS / CITY NEWS / DELHI NEWS / GRAP's Grip Loosened As Air Quality Shows Improvement in Delhi-NCR

TRENDING Hubballi Campus MCA student Death CM Conrad K Sangma DK Shivakumar

THIS STORY IS FROM JANUARY 19, 2024

GRAP's grip loosened as air quality shows improvement in Delhi-NCR

TNN / Updated: Jan 19, 2024, 06:47 IST

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19 Jan 2024

The Commission for Air Quality Management in NCR and adjoining areas revoked all GRAP Stage III measures, including restrictions on construction, demolition, ... [Read More](#)



Accomplishments

- Operationalization of 72-h air quality forecasts for four new cities of India namely Pune, Mumbai, Ahmedabad, and Jaipur.
- Use of 72-h air quality forecasts in Delhi by the Commission for Air Quality Management.
- Four Peer-reviewed paper and three conference presentations describing activities of this project.



Peer-reviewed Publications

Govardhan, G., Ghude, S. D., R. Kumar, Sharma, S., Gunwani, P., Jena, C., Yadav, P., Ingle, S., Debnath, S., Pawar, P., Acharja, P., Jat, R., Kalita, G., Ambulkar, R., Kulkarni, S., Kaginalkar, A., Soni, V. K., Nanjundiah, R. S., and Rajeevan, M.: Decision Support System version 1.0 (DSS v1.0) for air quality management in Delhi, India, *Geosci. Model Dev.*, 17, 2617–2640, <https://doi.org/10.5194/gmd-17-2617-2024>, 2024.

Kalita, G., Prafull P. Yadav; Rajmal Jat; Gaurav Govardhan; Rupal Ambulkar; Rajesh Kumar; Preeti Gunwani; Sreyashi Debnath; Pratul Sharma; Santosh Kulkarni; Akshara Kaginalkar; Sachin D Ghude, Forecasting of an unusual dust event over Western India by the Air Quality Early Warning System, *Atmos. Environ.*, 311, 120013, <https://doi.org/10.1016/j.atmosenv.2023.120013>, 2023.

Jat, R., Jena, C., Sachin D. Ghude, Rachana Kulkarni, Sreyashi Debnath, R. Kumar, Vijay Kumar Soni, Prodip Acharja, Santosh H Kulkarni, Manoj Khare, Akshara J. Kaginalkar, Dilip M. Chate, Kaushar Ali, Ravi S. Nanjundiah, and Madhavan Rajeevan, Evaluating the sensitivity of fine particulate matter (PM_{2.5}) simulations to chemical mechanism in Delhi, *Atmos. Environ.*, 323, 120410, <https://doi.org/10.1016/j.atmosenv.2024.120410>, 2024.

Sachin D Ghude, Gaurav Govardhan, R. Kumar, Prafull P. Yadav, Rajmal Jat, Sreyashi Debnath, Gyatri Kalita, Chinmay Jena, Shubhangi Ingle, Preeti Gunwani, Pooja Pawar, Rupal Ambulkar, Sumit Kumar, Santosh Kulkarni, Akshay Kulkarni, Manoj Khare, Akshara Kaginalkar, Vijay Soni, Narendra Nigam, Kamaljit Ray, S D Attri, Ravi Nanjundiah, M Rajeevan, Air Quality Warning and Integrated decision Support system for Emissions (AIRWISE): Enhancing Air Quality management in Megacities, under review, *Bulletin of the American Meteorological Society*, submitted: April 2024.



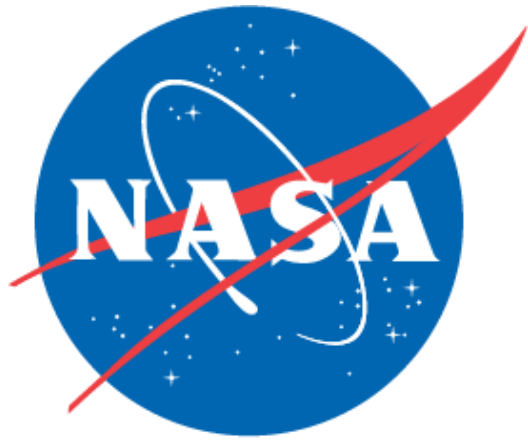
Conference Presentations

Kumar, R., S. D. Ghude, G. Govardhan, C. Jena, V. K. Soni, P. Yadav, and S. Debnath, Enhancing Air Quality Decision-Making Activity in Indian Megacities through Assimilation of NASA Earth Observations, AMS 103rd Annual Meeting, 8-12 Jan 2023, Denver and online.

Maryam Golbazi, John Schreck, Scott Meech, Rajmal Jat, Prafull Yadav, Gaurav Govardhan, R. Kumar, Sachin D Ghude, Stefano Alessandrini and William Y Y Cheng, Enhancing the Development of an Air Quality Early Warning System for Indian Megacities through High-Resolution Forecasting and Machine Learning Techniques, AGU Fall Meeting, 11-15 Dec 2023, San Francisco, USA.

R. Kumar, M. Golbazi, J. Schreck, S. D. Ghude, G. Kalita, P. Yadav, R. Jat, G. Govardhan, C. Jena, V. K. Soni, and S. Debnath, Using NASA Earth Observations to Improve Air Quality Decision-Making Activity in Indian Subcontinent, AMS 104th Annual Meeting, 28 Jan - 1 Feb 2024, Baltimore, MD and online.





HEALTH & AIR QUALITY

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Thanks for your attention!

