NCAP-COALESCE

CarbOnaceous AerosoL Emissions, Source apportionment & ClimatE impacts Understanding scientific complexities related to carbonaceous aerosols focussing on issues underlying their origin and fate, and their role as drivers of regional climate change over India.



Generalised non-negative matrix factorisation for air

pollution source apportionment

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Key highlights:

- GNMF approach proposed for source apportionment (SA) application.
- GNMF uses error covariance between different elements of concentration matrix.
- Multiplicative & projected gradient based rules to iteratively update G & F matrices.
- GNMF method subsumes existing NMF methods as special cases.
- Utility demonstrated on a field dataset derived simulated SA problem.

Summary of your Research:

EPA-PMF is widely used for apportionment source application in the literature. EPA-PMF makes an implicit assumption that all the samples and species are uncorrelated. However, that may not be the case in reality. Filters are often subjected to similar storage and transportation conditions, the chemical analysis instruments used may use the same calibration equation over several samples introducing cross-correlation in same species different across samples and same species in am sample.

To account for the covariance source information ignored in normal apportionment source methods, GNMF method is developed. Unlike other methods in the literature which only incorporate partial information, GNMF method incorporates fill covariance information to minimise the objective function.



GNMF method has two update methods namely, multiplicative (similar to NMF updates) and projected gradient based update. GNMF method with projected gradient based updates ensures sufficient decrease at each step. On a simulated dataset obtained from real field measurements, the GNMF method performs better in obtaining the G and F matrices as compared to EPA-PMF and other NMF methods in the literature.



Fig: Source profile & source contribution plots shown for GNMF & NNMF-LS method.

Take away/conclusion :

This study forms the mathematical basis for GNMF method. The GNMF method overcomes the issue of NMF method not incorporating complete error variance-covariance information. For a typical source apportionment application using data obtained from field measurements, GNMF method is shown to perform better in recovering the true values of G and F matrices as compared to other methods in the literature. GNMF method also performed better when the errors are non-normal (heavy-tailed) which is typical in environmental datasets. **Research Article citation**

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