

References attachment for: **Ensemble Machine Learning and Multi-Stage Data Reconstruction Methods for High-Resolution Air Quality Mapping in Great Britain (2003-2021)**. (under submission 16-04-2024)

Main and poster-relevant references highlighted.

[Satellite icons created by mavadee - Flaticon](https://www.flaticon.com/free-icons/satellite "satellite icons")

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