



Transboundary Air Pollution: Strengthening ASEAN-APCTT
Cooperation through Integrated Technology, Policy, and Field
Practices for Sustainable Air Quality 3 Feb 2026

The Spatial-Temporal Analysis of Air Pollution Zones Using Geo-Informatic Technology

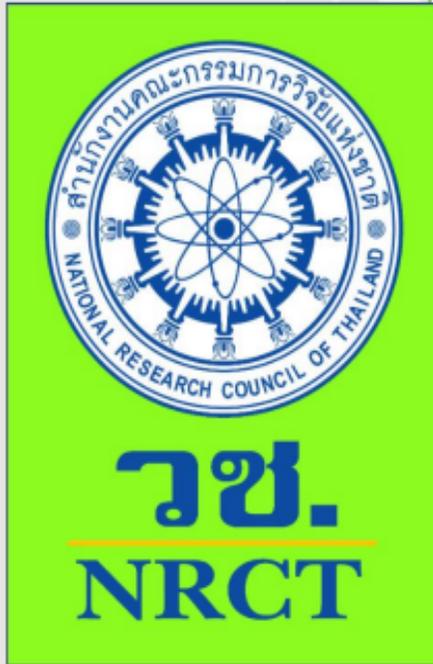
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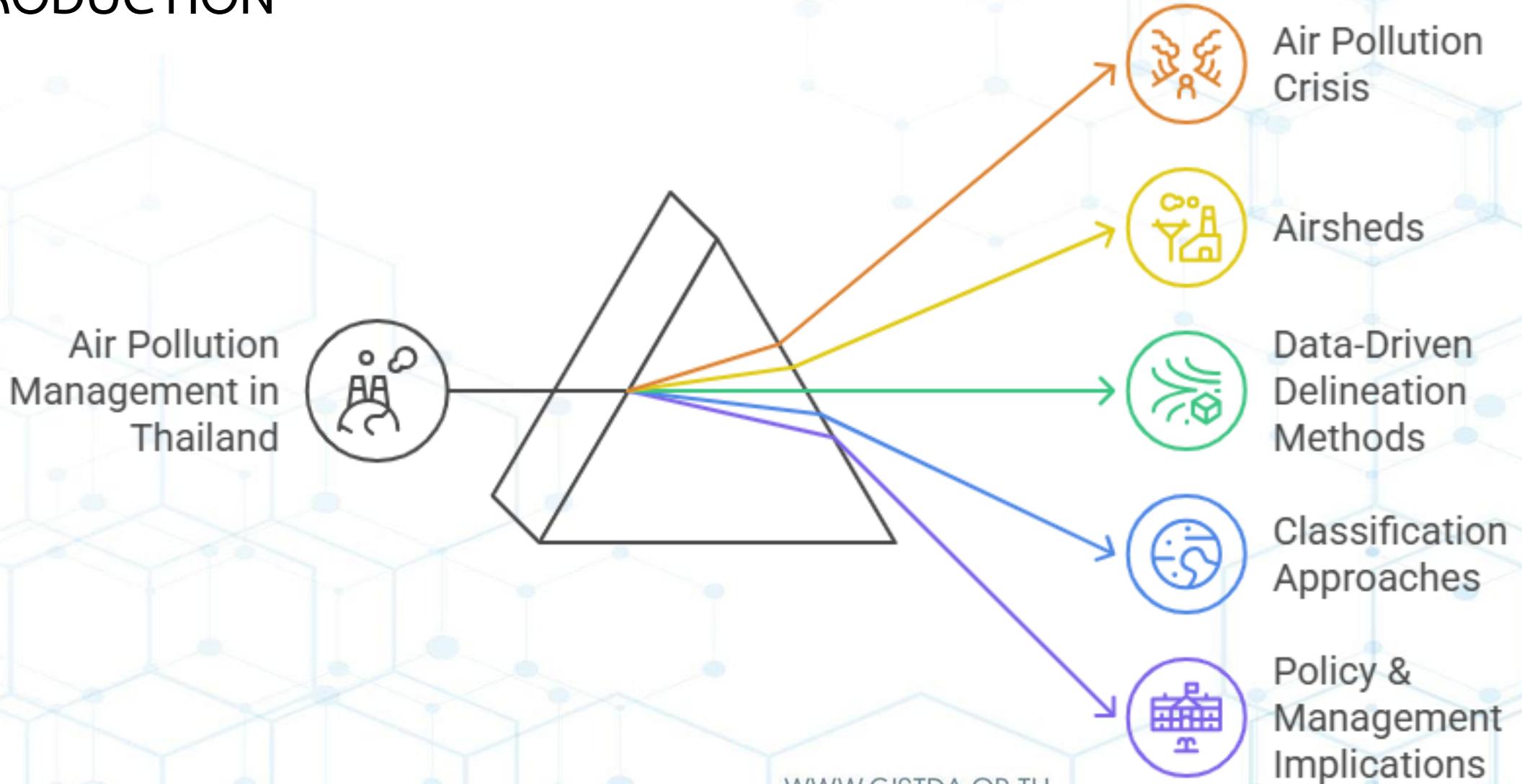
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Geo-Informatics and Space Technology Development Agency

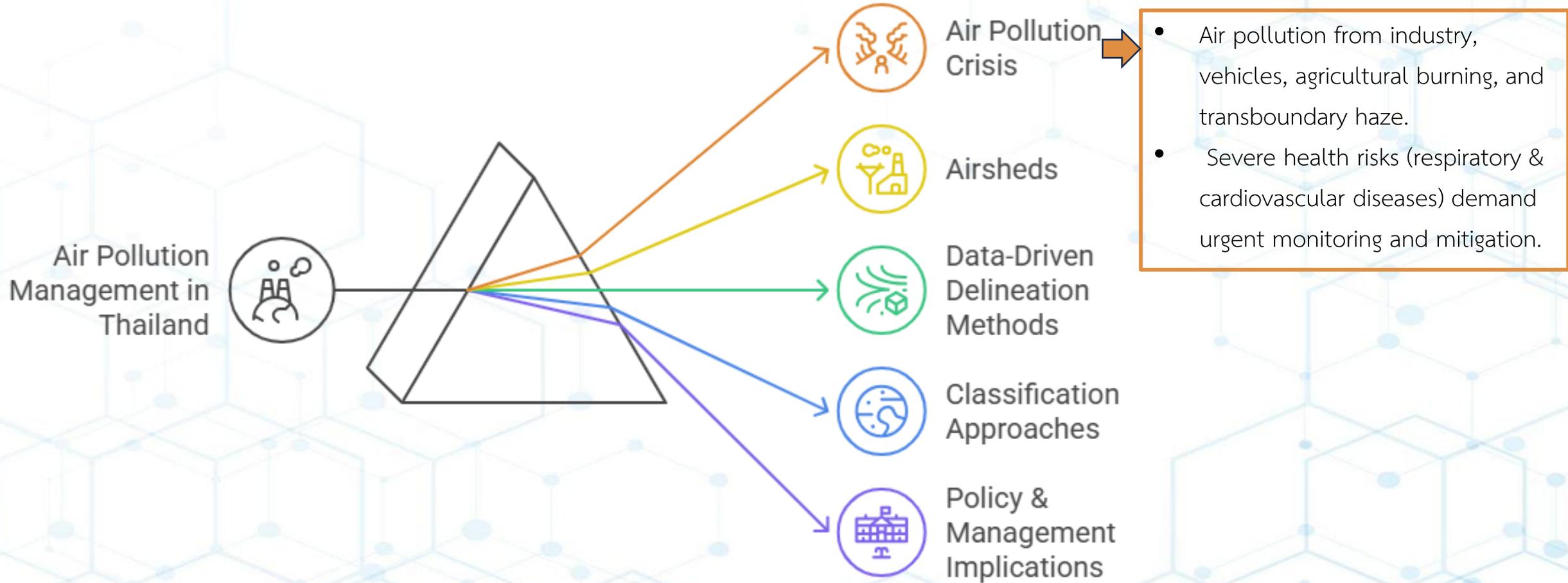
INTRODUCTION



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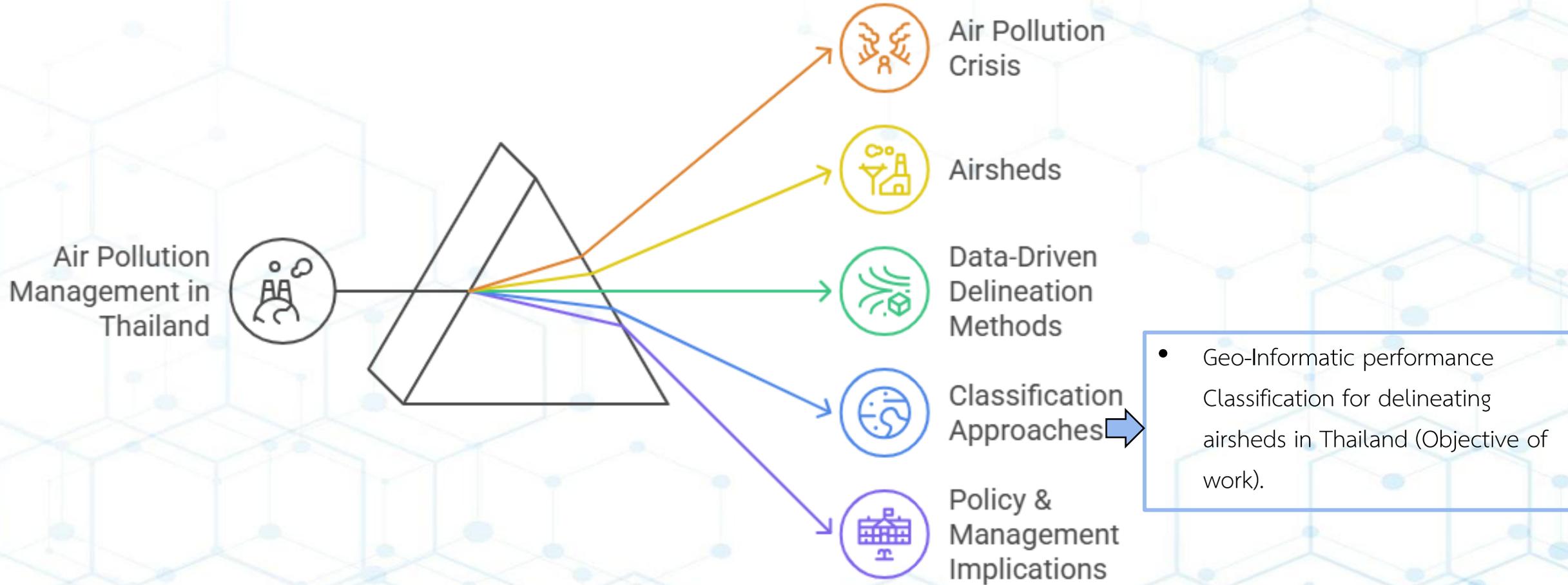
- Geographic zones where pollutants accumulate due to terrain and weather.
- Better than administrative boundaries for pollution management and policy.

INTRODUCTION

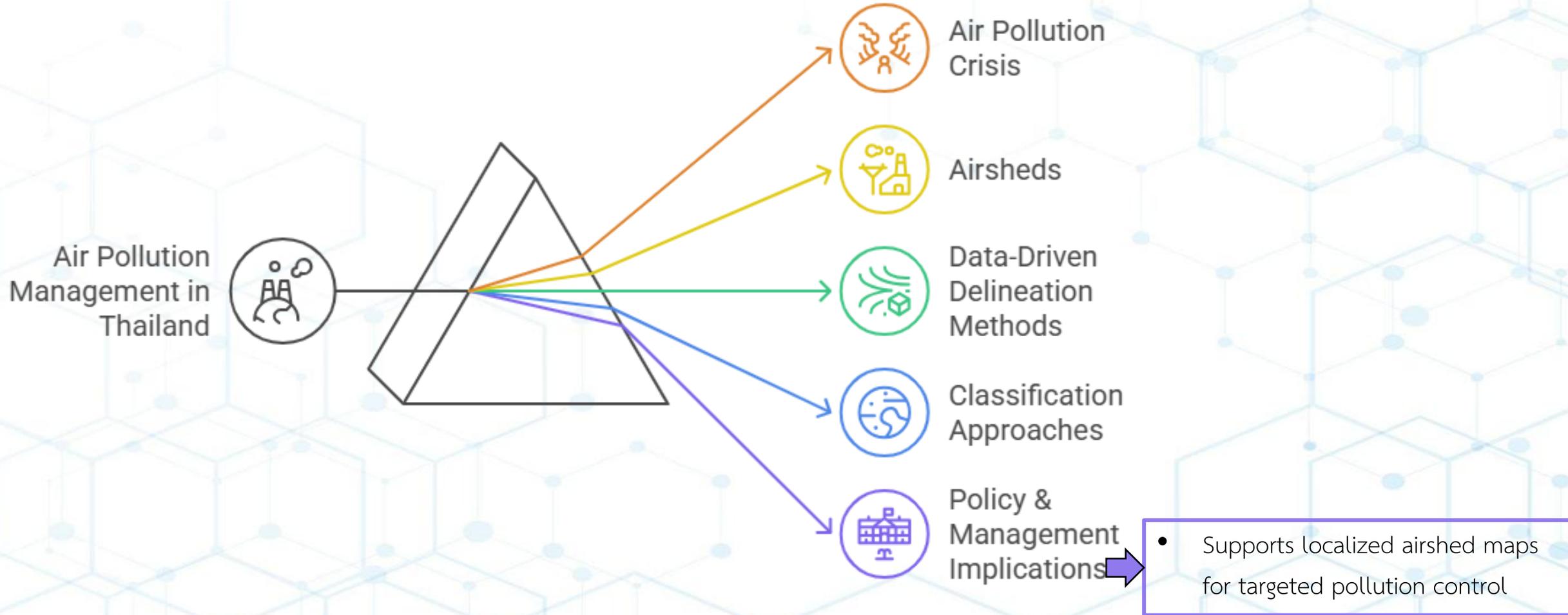


- Uses satellite DEM and meteorological data (wind, pressure, radiation).
- Machine learning (unsupervised clustering) identifies pollution patterns without pre-labeled data.

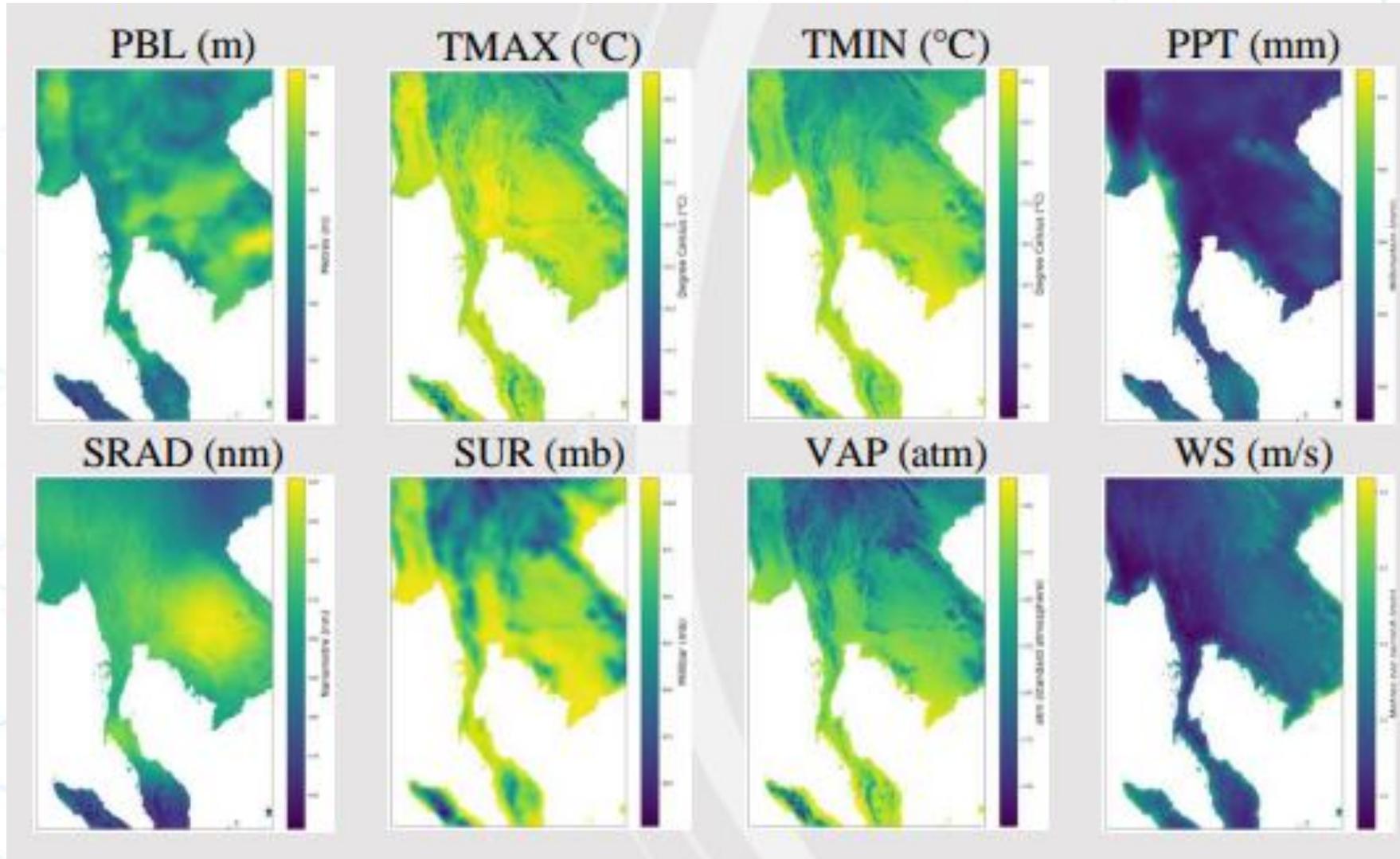
INTRODUCTION



INTRODUCTION



DATA COLLECTIONS



21-year monthly meteorological data with topographical features

DATA COLLECTIONS

PBL (m)	TMAX (°C)	TMIN (°C)	PPT (mm)
Meteorological Parameters		Source	
Boundary Layer Height (PBL)		ERA5	
Surface Pressure (SUR)		ERA5	
Precipitation (PPT)		TerraClimate	
Downward Surface Shortwave Radiation (SRAD)		TerraClimate	
Maximum Temperature (TMAX)		TerraClimate	
Minimum Temperature (TMIN)		TerraClimate	
Vapor Pressure (VAP)		TerraClimate	
Wind Speed (WS)		TerraClimate	
Digital Elevation Model (DEM)		NASADEM_HG Tv001	



21-year monthly meteorological data with topographical features

MODEL PROCESSING

The Elbow Method is a fundamental technique for determining the optimal number of clusters (k) in unsupervised machine learning applications.

Step	Process Stage	Description	Role of Elbow Method
1	Data Preparation	Spatial data preprocessing (Object / Pixel level)	Not yet applied
2	Feature Analysis	Statistical parameter calculation (Mean / Mode)	Not yet applied
3	Clustering	K-Means / ISODATA implementation (testing k = 2–10)	Determines optimal k value
4	Region Finalization	Definitive geographical boundary delineation	Applies optimized k from Elbow

MODEL PROCESSING

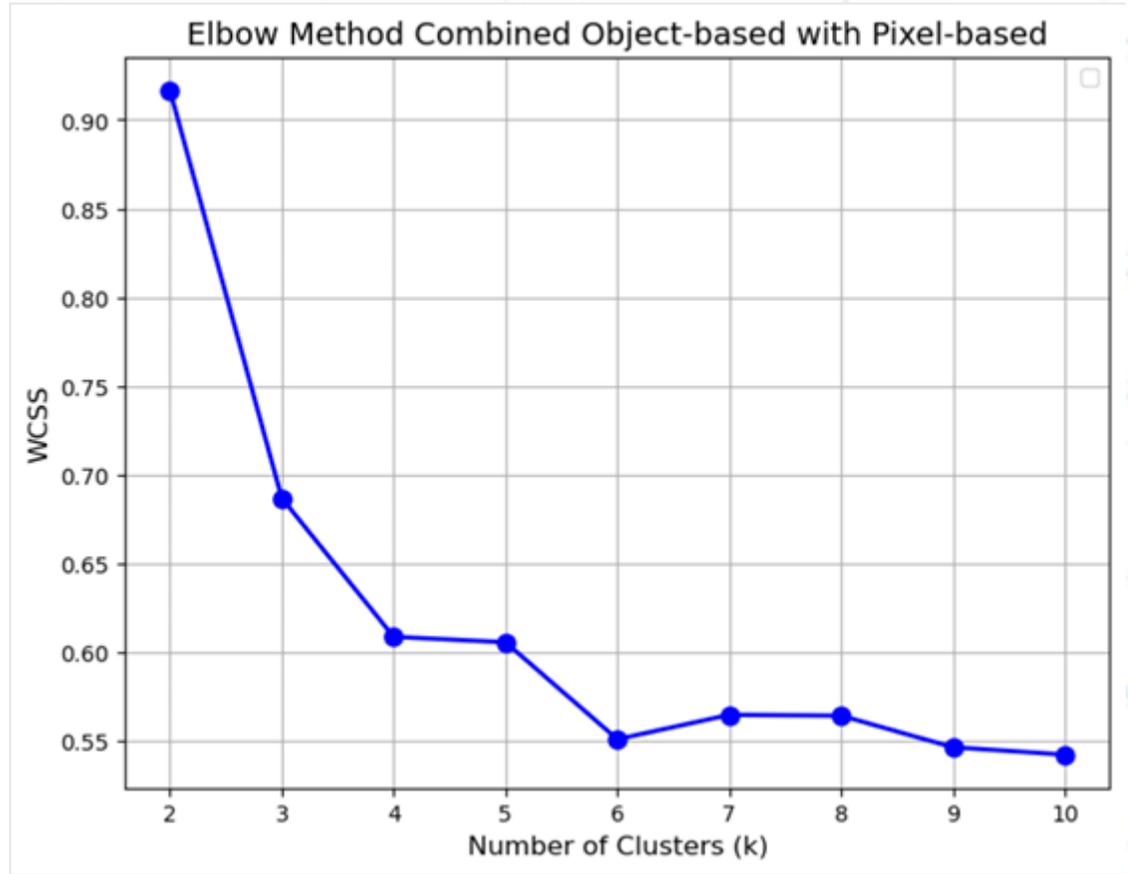
The Elbow Method is a fundamental technique for determining the optimal number of clusters (k) in unsupervised machine learning applications.

Within-Cluster Sum of Squares (WCSS) Calculation:

$$WCSS = \sum_{i=1}^k \sum_{x \in C_i} \|x_i - \mu_i\|^2$$

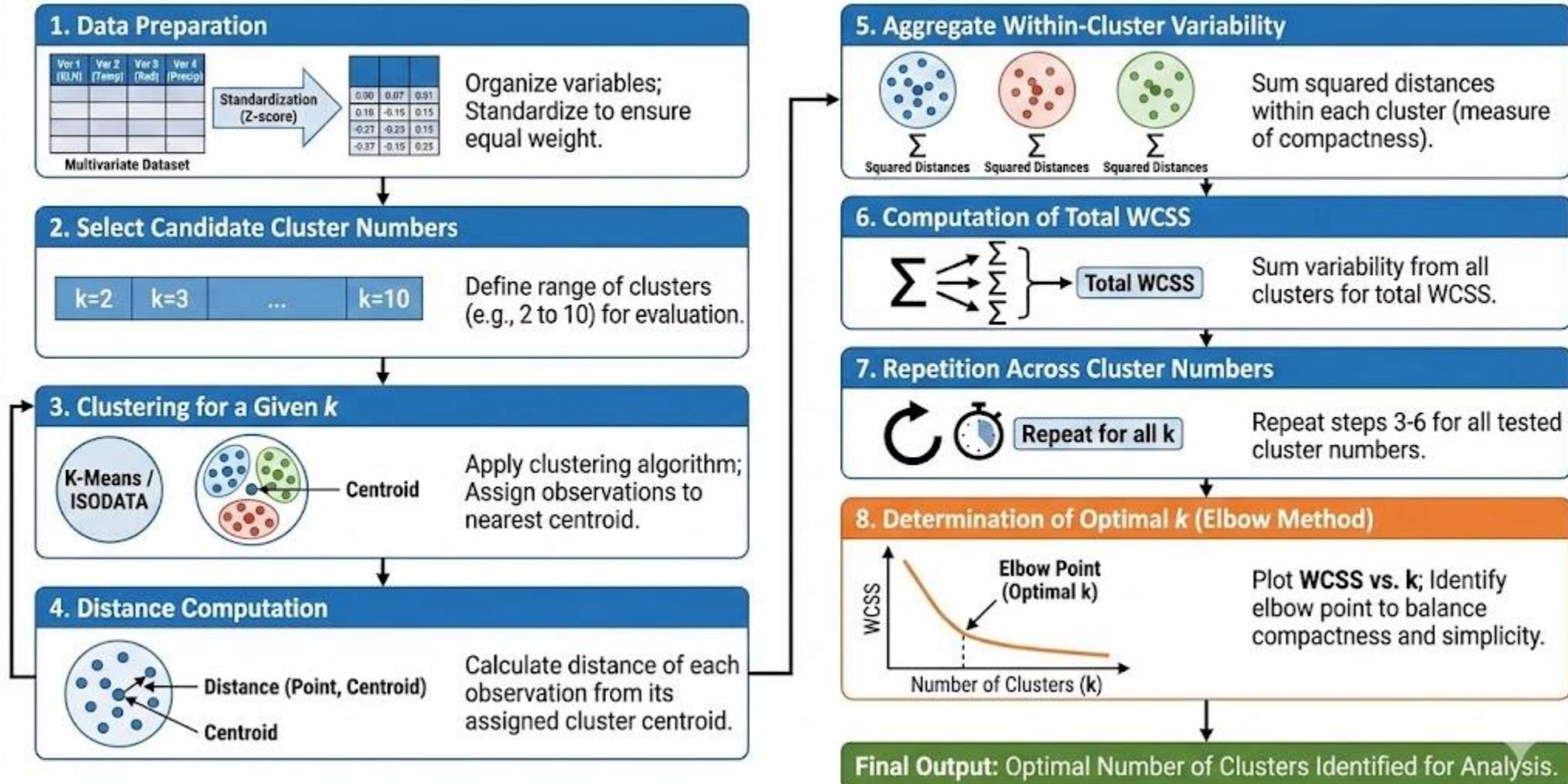
Optimal Cluster Selection:

1. The optimal k corresponds to the elbow point
2. In this study: k=4 was identified as optimal for both classification methods

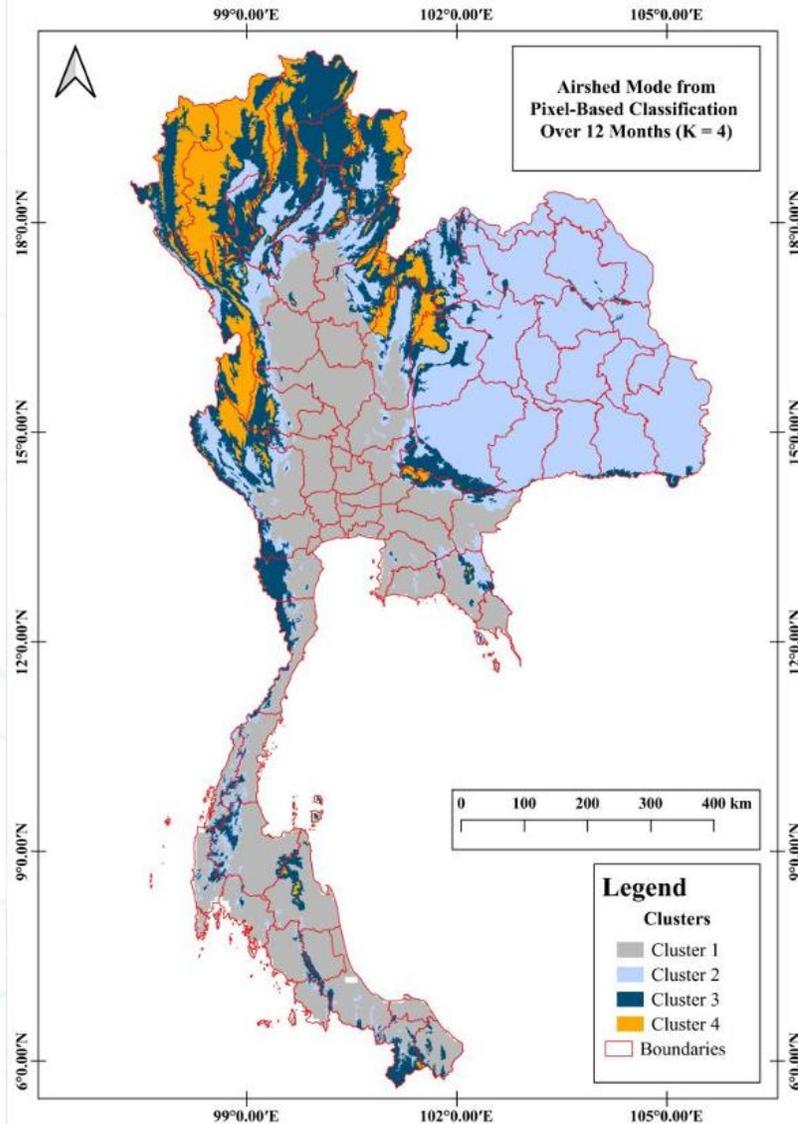


MODEL PROCESSING

Step-by-Step WCSS Calculation Flowchart

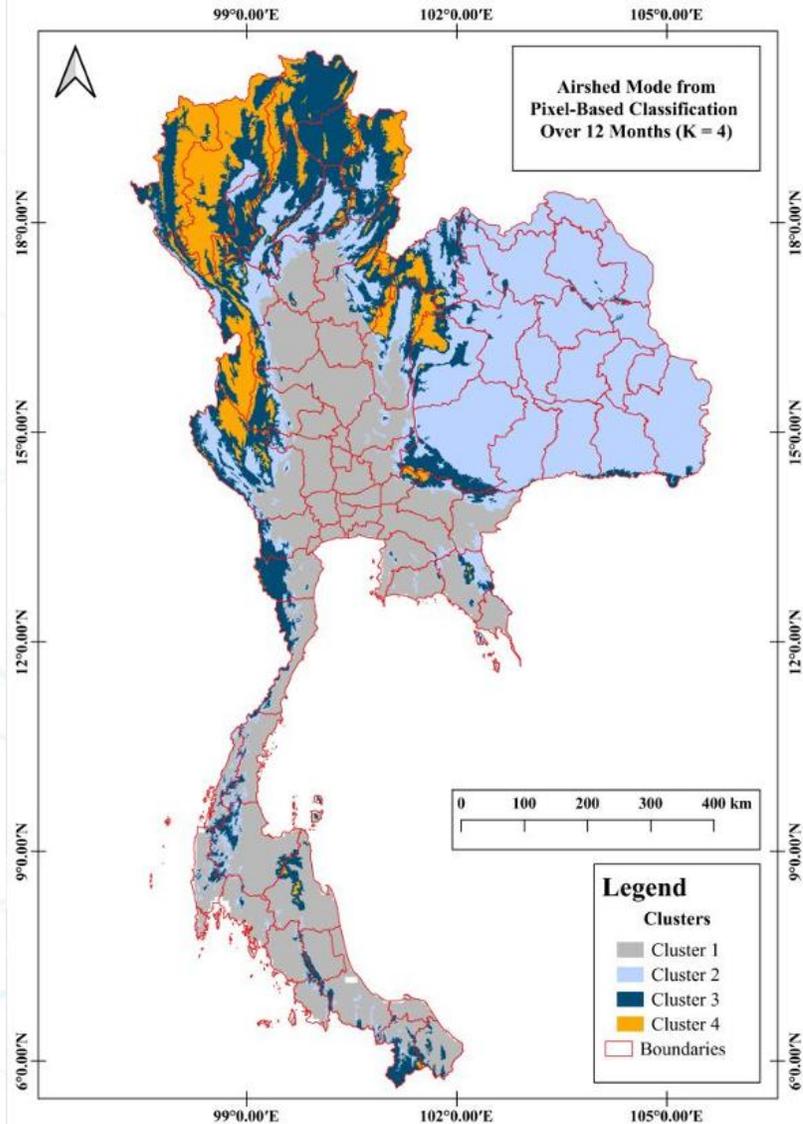


RESULTS



Variable	Cluster 1	Cluster 2	Cluster 3	Cluster 4
DEM (m)	27.89	177.61	435.47	808.94
PBL (m)	556.08	488.48	434.99	427.62
PPT (mm)	174.36	154.87	133.94	113.59
SRAD	218.31	218.96	214.92	211.65
SUR (hPa)	1006.54	988.10	960.09	934.19
TMAX (°C)	32.37	31.84	31.41	30.12
TMIN (°C)	23.80	22.04	20.43	18.73
VAP	2.93	2.62	2.44	2.20
WS (m s ⁻¹)	1.84	1.41	1.21	1.28

RESULTS

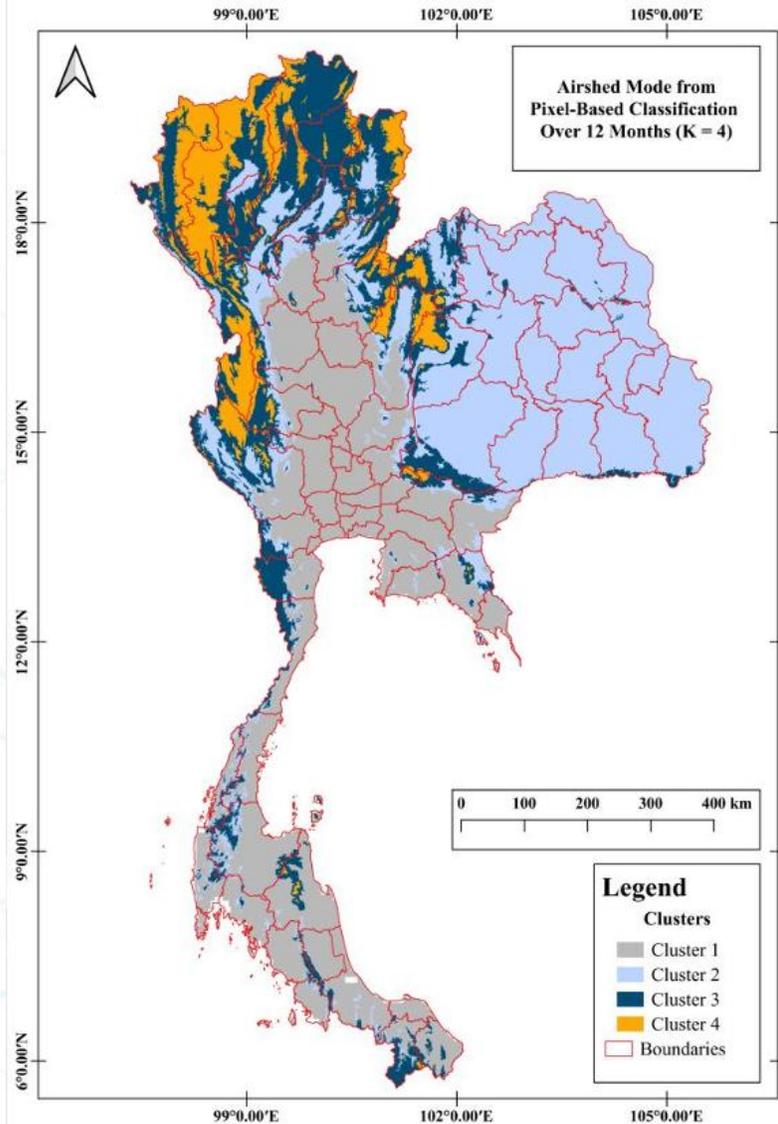


Cluster 1

Areas with low topographic elevation

- Characterized by the lowest average elevation, with high temperature and high relative humidity.
- Efficient wind circulation promotes good atmospheric ventilation.
- As a result, this airshed exhibits the lowest susceptibility to PM2.5 pollution among all groups.

RESULTS

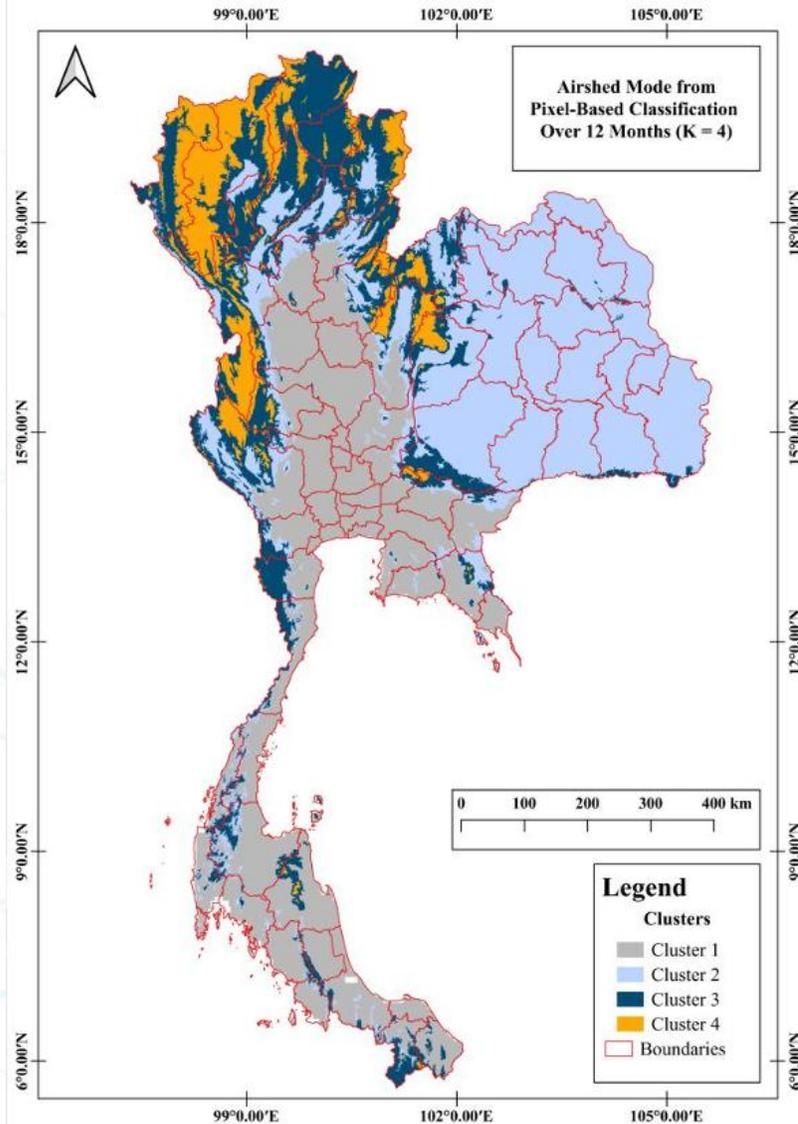


Cluster 2

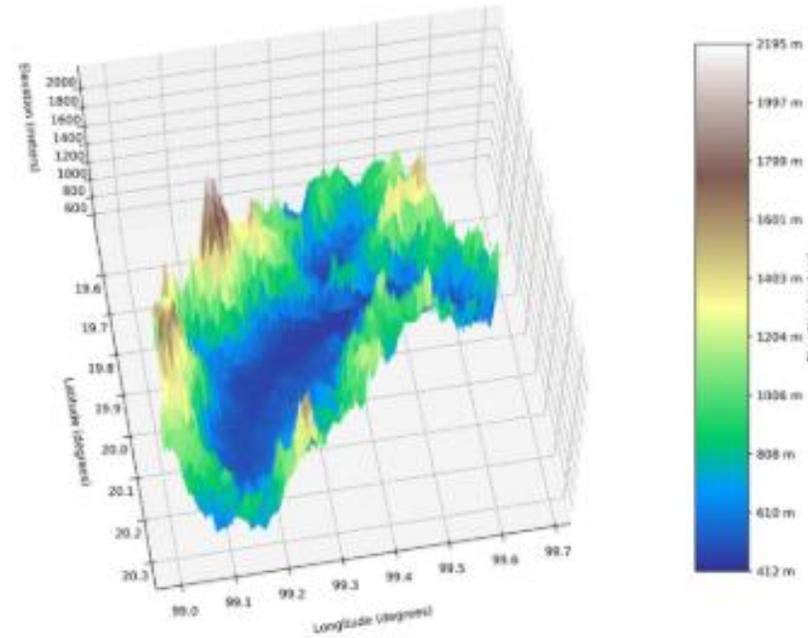
Regions with flat topography and moderate elevation

- The average topographic elevation corresponds to **flat terrain with moderate elevation**.
- Meteorological variables show a **decreasing trend** compared to Cluster 1.
- This group exhibits a higher susceptibility to PM2.5 impacts when compared to Cluster 1.

RESULTS



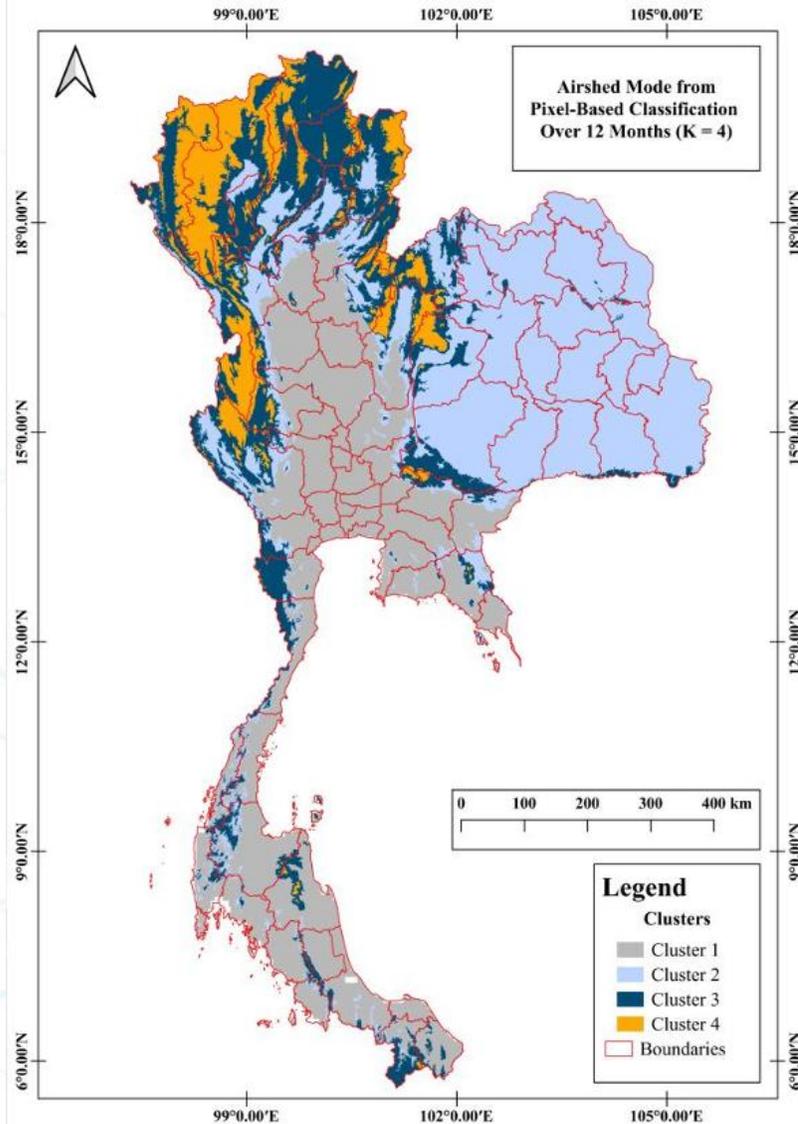
Cluster 2



Regions with flat topography and moderate elevation

Note: Several areas in Northern Thailand are classified as Cluster 3 and 4, which are characterized by terrain surrounded by high mountains. This topographic configuration can form basin-like environments, potentially enhancing pollutant accumulation and worsening air quality conditions.

RESULTS

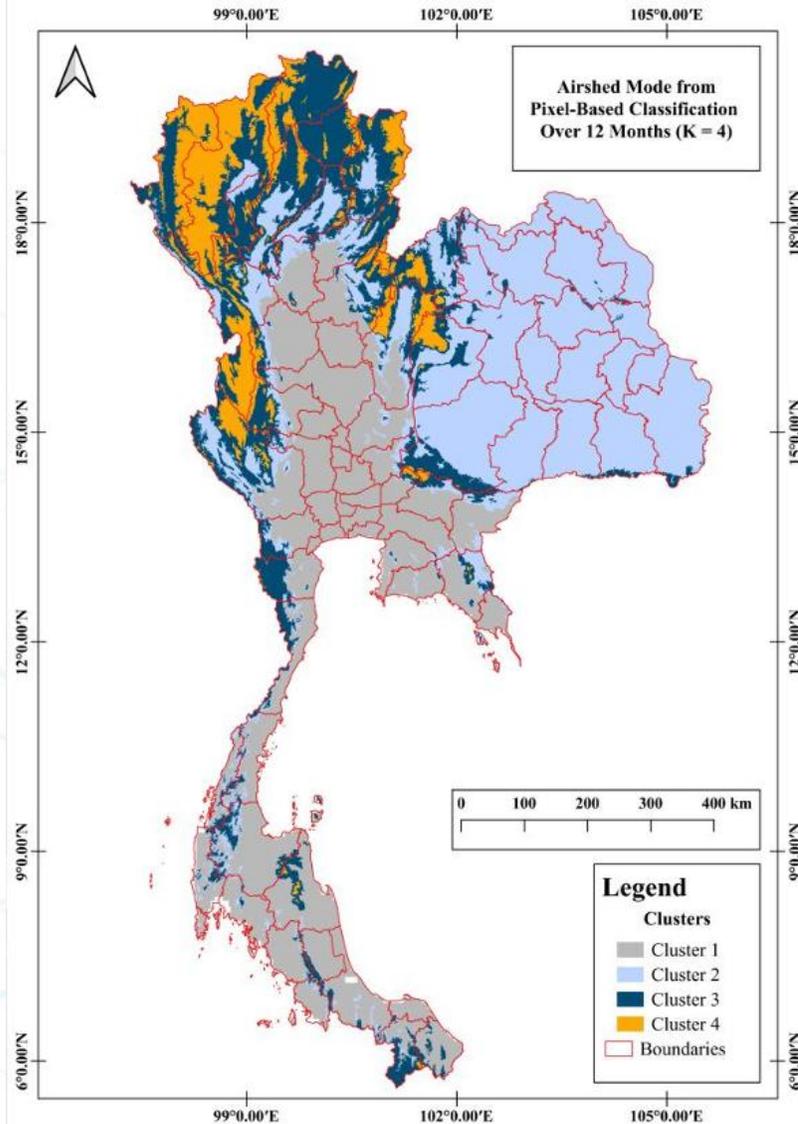


Cluster 3

Areas in this group are characterized by hilly terrain or highland areas.

- The average topographic elevation is higher than that of Cluster 1 and 2.
- Mean climatic variables across all factors show a **declining trend compared** to Cluster 1 and 2.
- This group exhibits a clearly higher susceptibility to PM2.5 impacts than Cluster 1 and 2, which is closely associated with the increasing topographic elevation.

RESULTS

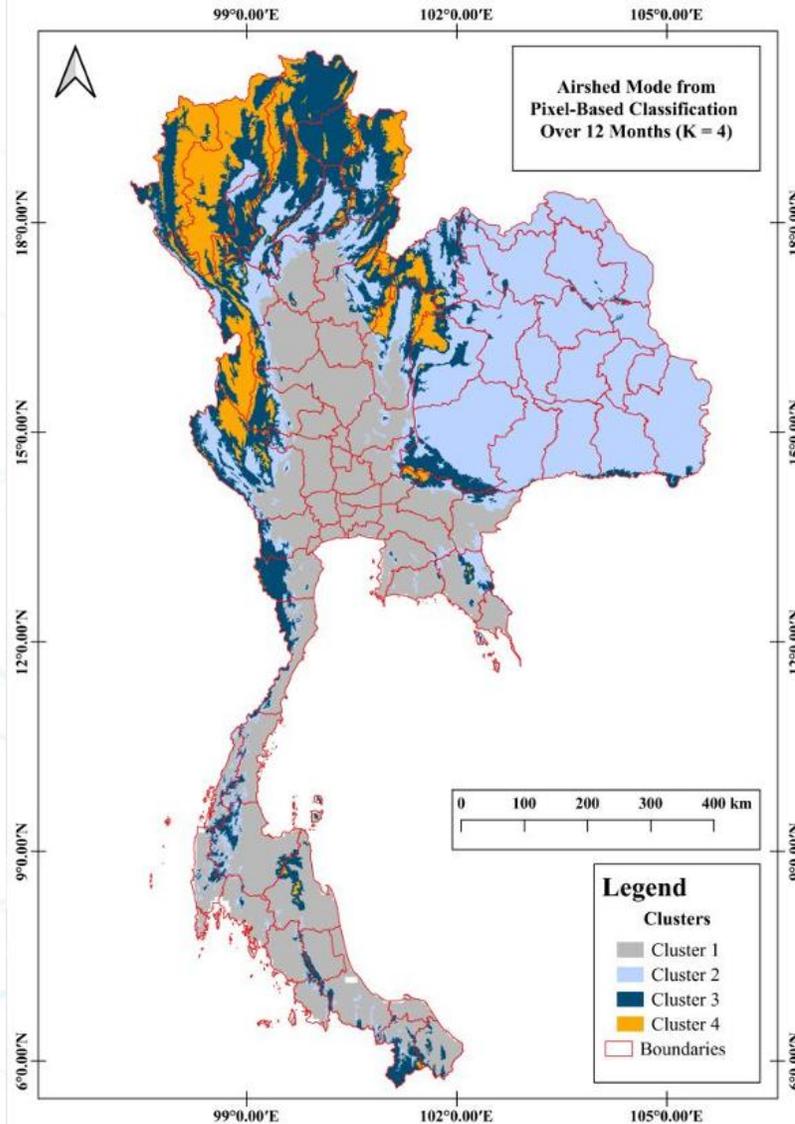


Cluster 4

Areas in this group are characterized by high mountainous terrain.

- The average topographic elevation is the highest among all four groups.
- Climatic variables across all factors are at the lowest levels.
- This group exhibits the highest susceptibility to PM2.5 impacts, reflecting a clear relationship between topographic elevation and meteorological factors.

RESULTS



Month	Cluster 1	Cluster 2	Cluster 3	Cluster 4
PM2.5 March	33.16	49.23	65.24	68.45
PM2.5 April	25.63	35.21	48.06	52.58

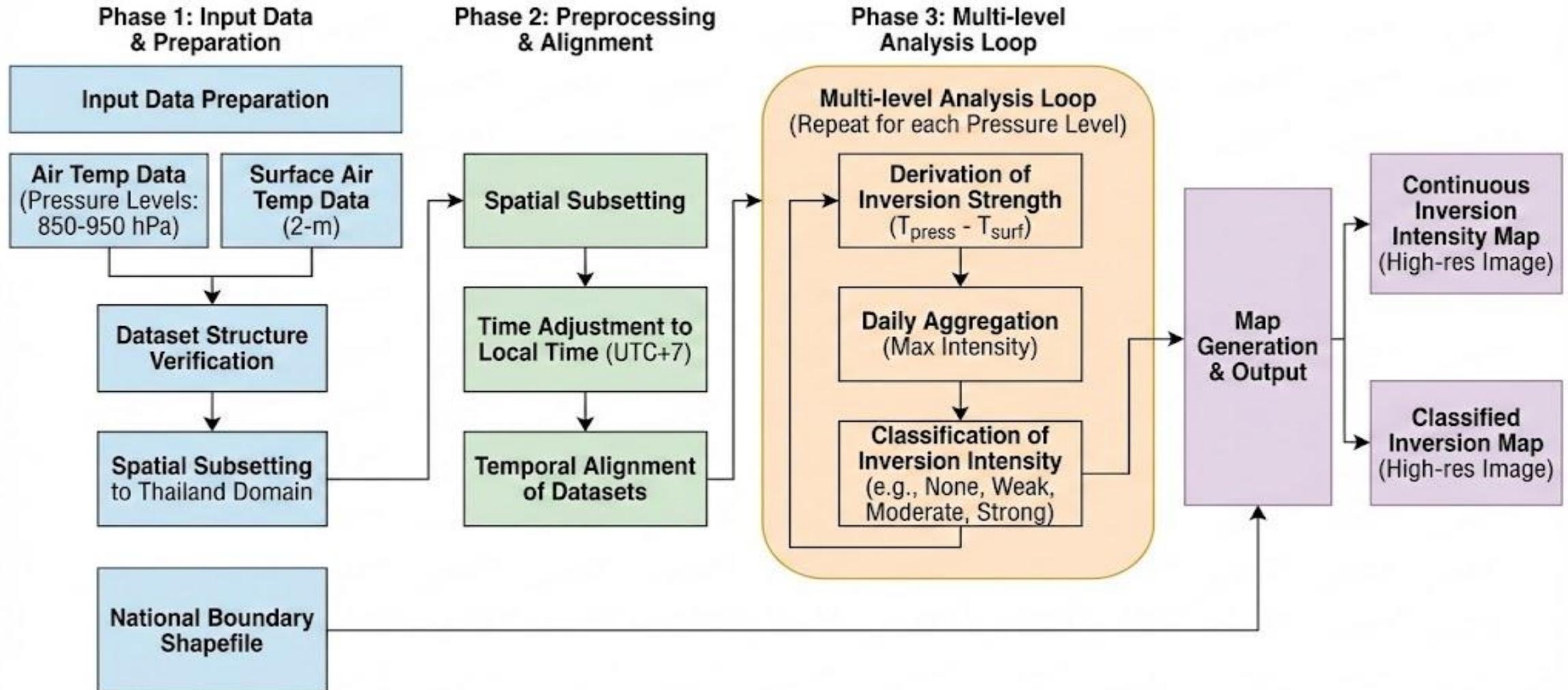
- Additional conditions may be required, particularly the inclusion of qualitative criteria. This is because several areas in Northern Thailand are classified as Cluster 2, while their surrounding terrain is dominated by high mountainous regions (Cluster 3 and 4).
- Such topographic settings can create basin-like environments, where air circulation is restricted. Consequently, these areas may experience PM2.5 impacts influenced by Cluster 3 and 4, despite being classified as Cluster 2 based on quantitative indicators.

REMARK

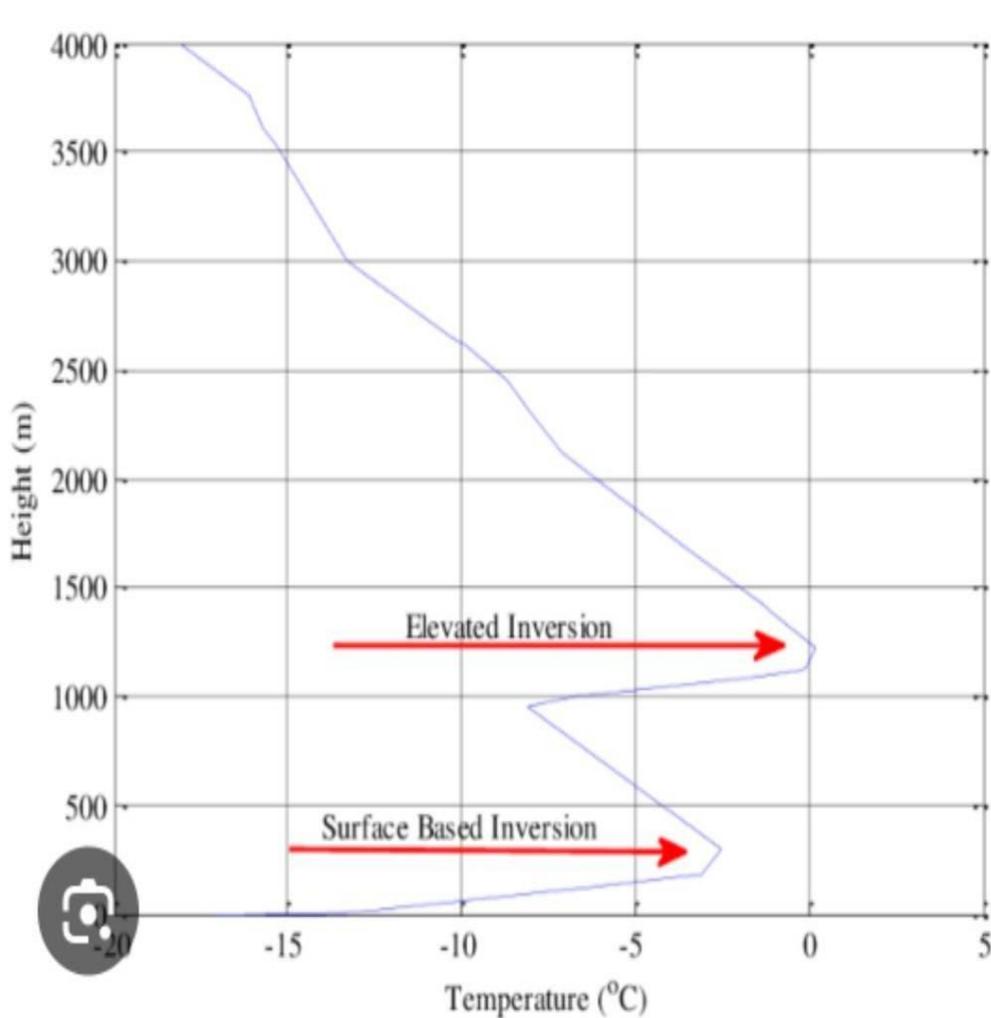
- The analysis is based on **21-year monthly meteorological data** combined with static topographical features, which may **not fully capture short-term atmospheric** variability.'
- The use of monthly aggregated data limits the ability to represent sub-monthly or daily dynamics, particularly during **extreme pollution episodes** or transient meteorological conditions.
- The current airshed delineation is therefore not fully dynamic, as it does not explicitly account for temporal changes in wind patterns, boundary layer evolution, or **inversion events**.

FUTURE PROCESSING

Workflow for Inversion Map Generation

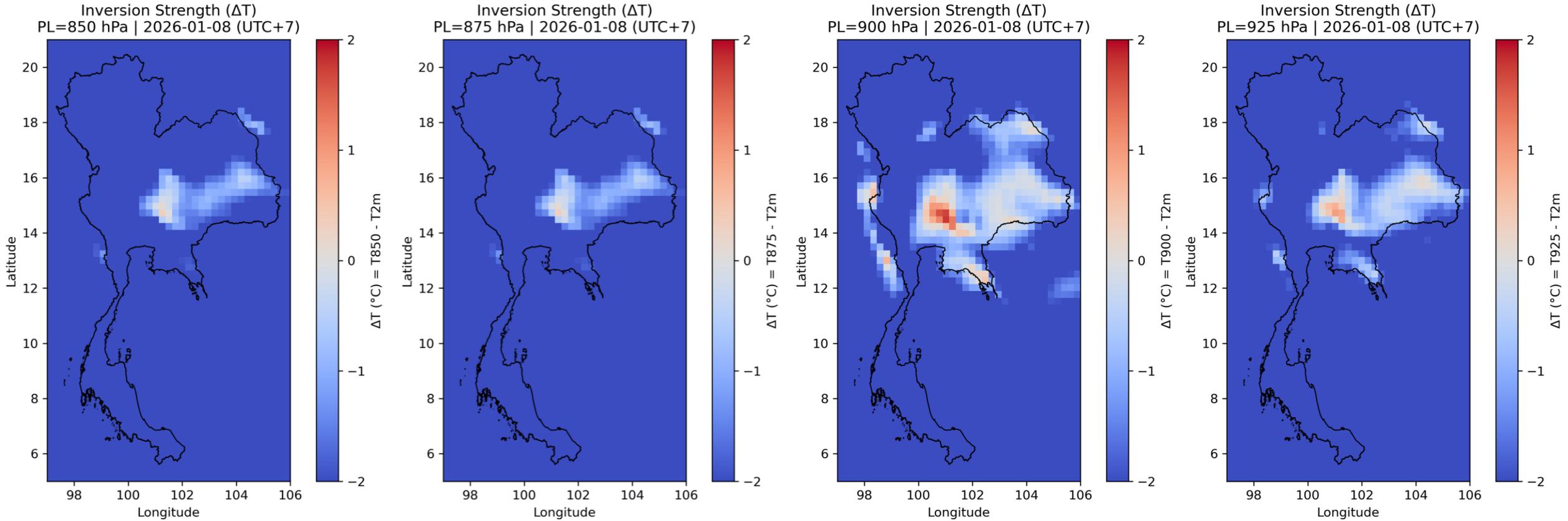


FUTURE PROCESSING

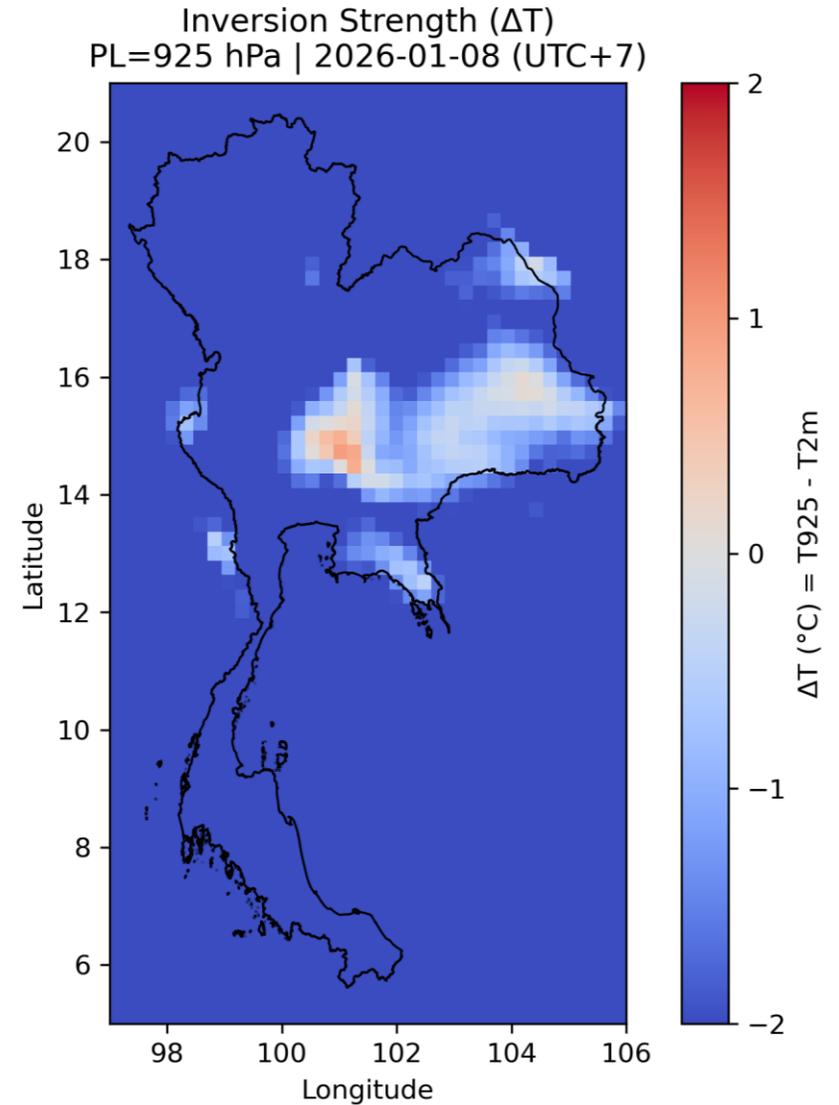
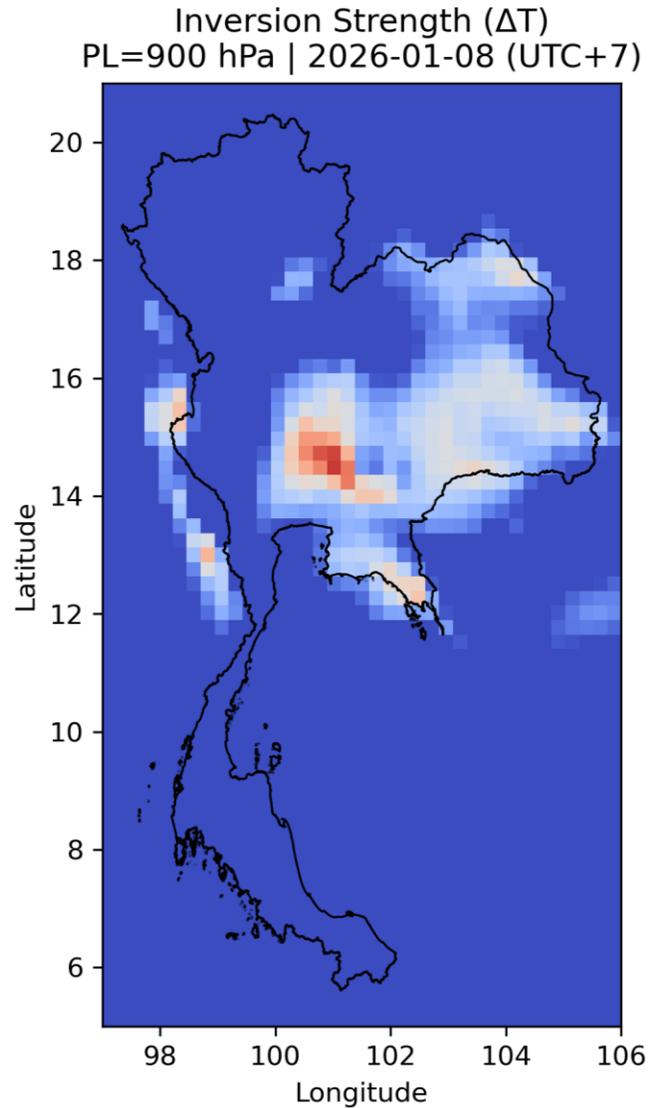
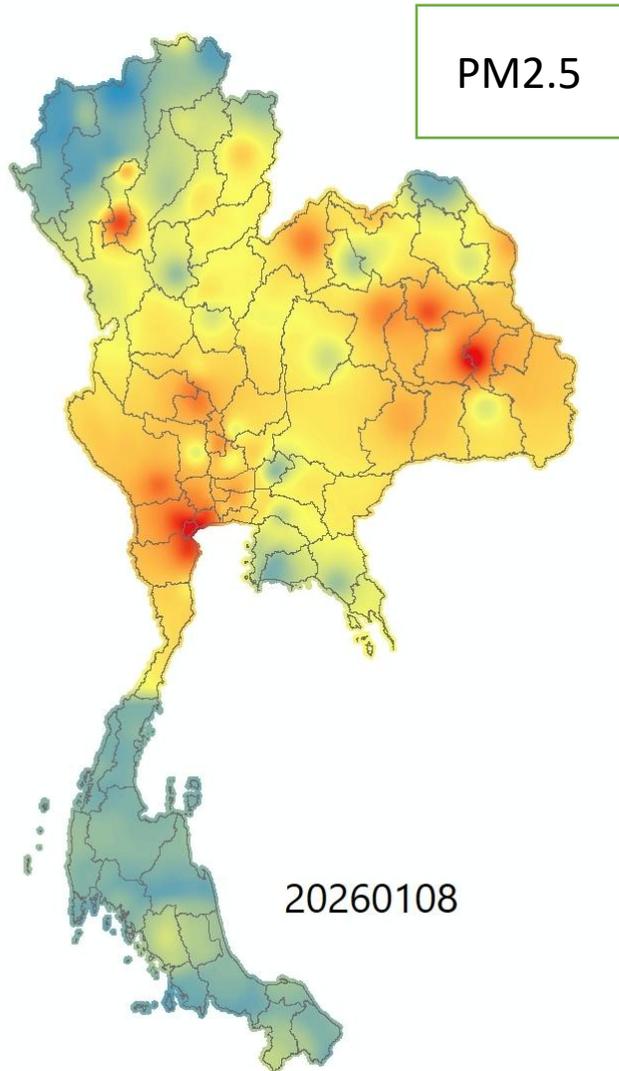


- The 900–850 hPa levels represent the lower troposphere, where elevated temperature inversions commonly occur and directly influence near-surface air quality.
- These levels typically correspond to altitudes around 900–1,300 m, matching the inversion layers observed in the vertical temperature profile.
- Inversions at 900–850 hPa act as a capping layer that suppresses vertical mixing, thereby enhancing PM_{2.5} accumulation near the surface.

FUTURE PROCESSING



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