

Discrepancies between Datasets

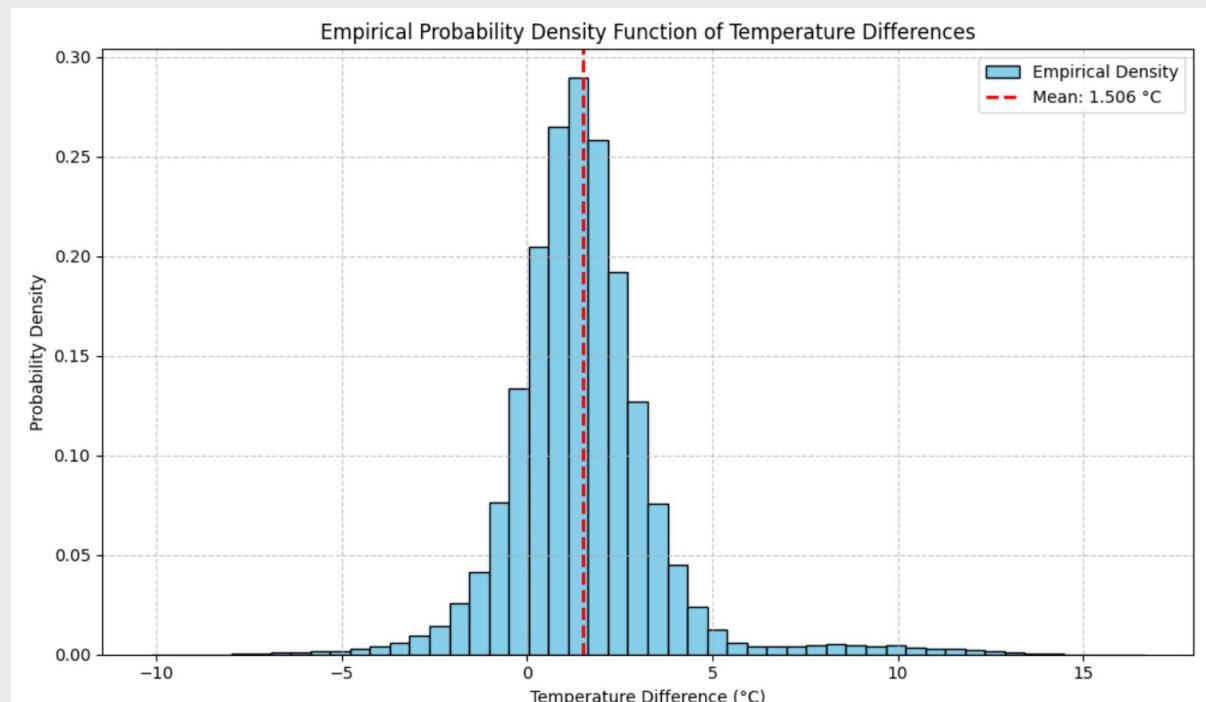
Comparing ERA5 and Weather Station Data

ERA5 vs Ground Truth

After matching the weather station temperature data with the nearest available ERA5 temperature data available in France, we found a difference:

Weather station data reports a higher temperature.

The mean of difference (weather station data - ERA5 data) ≈ 1.51 , standard deviation is 2.01.



Geographical Differences:

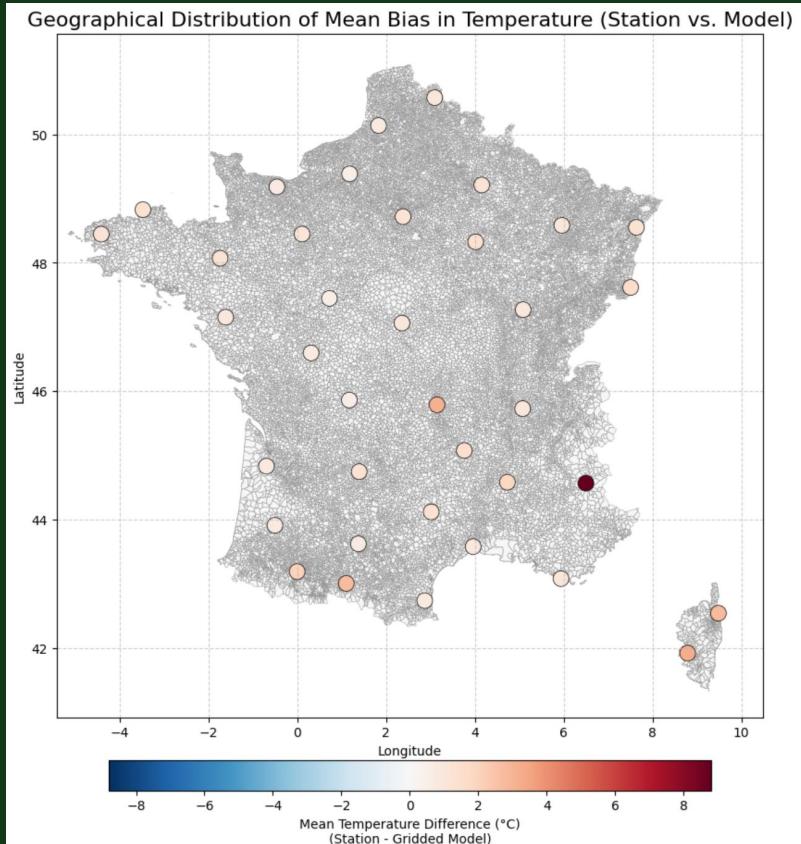
By looking at temperature difference in all 44 weather stations in France, we found out the differences to be significant across all regions.

| ID | Weather Station Name | Mean Temperature Diff | Significance |
|------|----------------------|-----------------------|----------------------------|
| 755 | EMBRUN | 8.80 | Significant ($p < 0.05$) |
| 2209 | AJACCIO | 3.23 | |
| 750 | CLERMONT-FERRAND | 3.10 | |
| 758 | BASTIA | 2.78 | |
| 2205 | ST-GIRONS | 2.73 | |

Top 5 Most Different Weather Stations

As shown on the right graph, the differences are more severe in the south-eastern region. Extreme outliers (e.g., Embrun +8.8° C) are driven by altitude/relief.

STRATEGIC DECISION: To capture the pure Urban Heat Island effect, we filtered the dataset to low-altitude stations (< 500m).



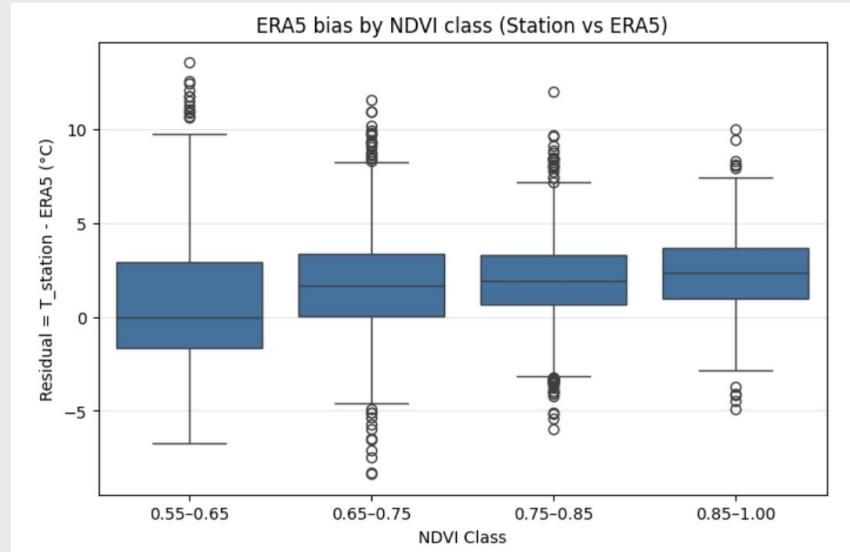
NDVI & Urbanization Effect on ERA5 Bias

Vegetation Strongly Modulates ERA5 Temperature Errors

Key Results

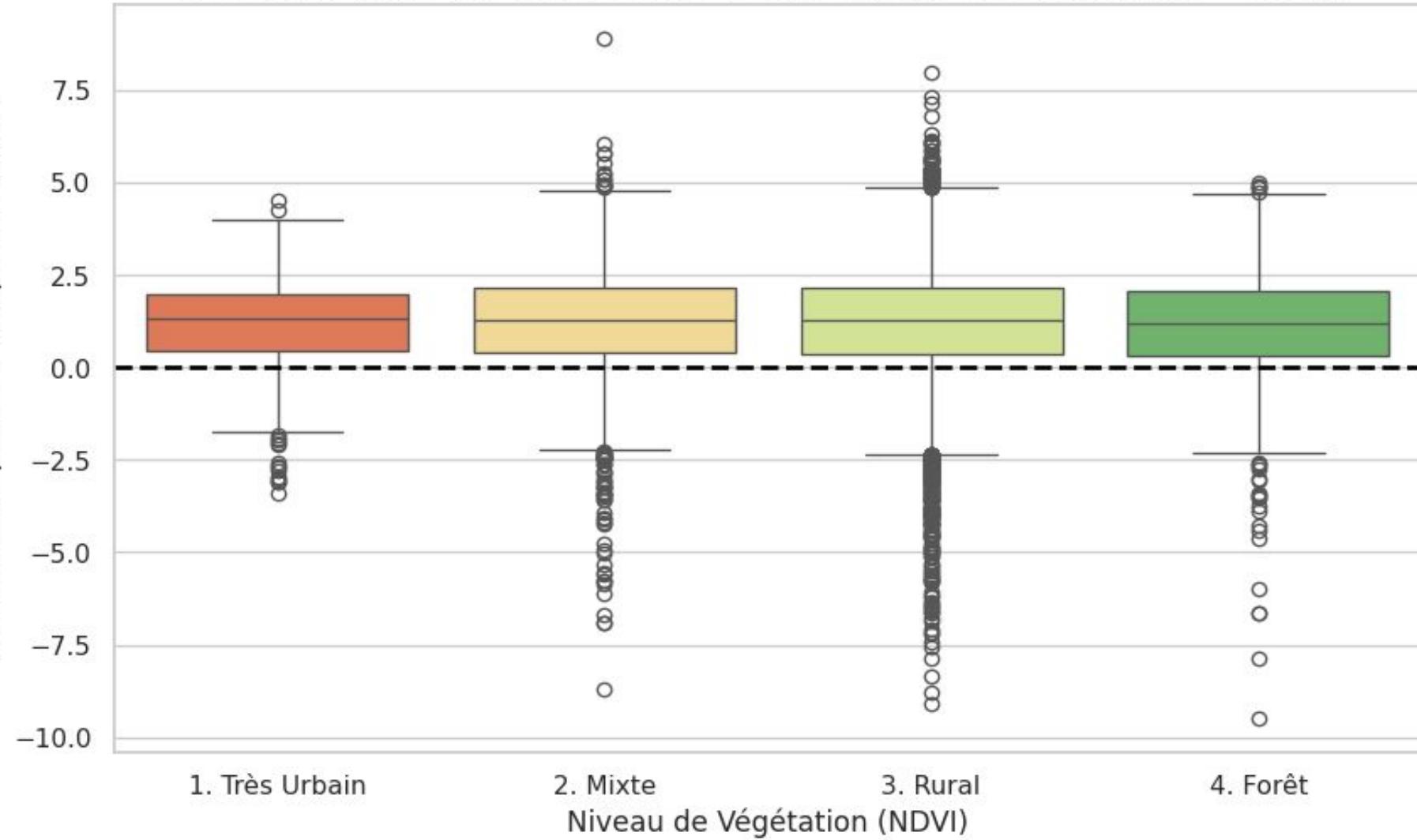
- ERA5 underestimates temperature in low-NDVI (urban-like) environments:
mean bias = -1.04°C .
- ERA5 overestimates temperature in high-NDVI (vegetated) regions:
mean bias = $+1.66^{\circ}\text{C}$.
- Error variability is highest in low-NDVI areas ($\text{std} = 3.57^{\circ}\text{C}$), reflecting the strong heterogeneity of urban microclimates that ERA5 cannot resolve.
- These patterns are consistent with an urban heat island signature: ERA5 smooths strong urban warming and fails to capture localized heat amplification.

| NDVI class | Mean bias | Std. dev. | Count |
|------------|-----------|-----------|-------|
| 0.55–0.65 | -1,04 | 3.57 | 576 |
| 0.65–0.75 | -0,74 | 2.43 | 1822 |
| 0.75–0.85 | -0,96 | 2.06 | 2175 |
| 0.85–1.00 | +1,66 | 2.03 | 947 |



Note: Analysis performed on a curated subset of stations with complete daily data and valid NDVI sampling to ensure comparability across NDVI, season, and altitude classes.

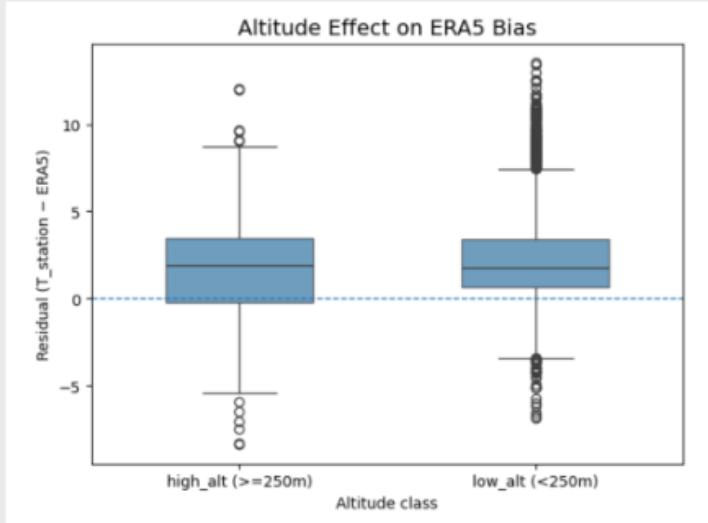
Erreurs (Station - ERA5) en °C
(>0 = Station plus chaude que le modèle)



Geographic Factors: Altitude, Latitude, Coastline

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| Region | Mean Bias (°C) | Std | RMSE | N |
|----------------|----------------|------|------|------|
| East / Inland | 2.11 | 2.56 | 3.32 | 4879 |
| West / Coastal | 1.38 | 2.61 | 2.95 | 1095 |



Altitude effect:

- Low-altitude ($< 250\text{ m}$): mean bias = $+2.29\text{ }^{\circ}\text{C}$
- High-altitude ($\geq 250\text{ m}$): mean bias = $+1.66\text{ }^{\circ}\text{C}$

Low-altitude stations tend to be more **urban and inland**, where ERA5 struggles the most to capture local heat amplification.

Coastline effect

ERA5 underestimation is **stronger inland** (mean = $+2.11\text{ }^{\circ}\text{C}$) than in west/coastal regions (mean = $+1.38\text{ }^{\circ}\text{C}$). Coastal thermal gradients make ERA5 slightly more reliable there.

Seasonal Bias Patterns

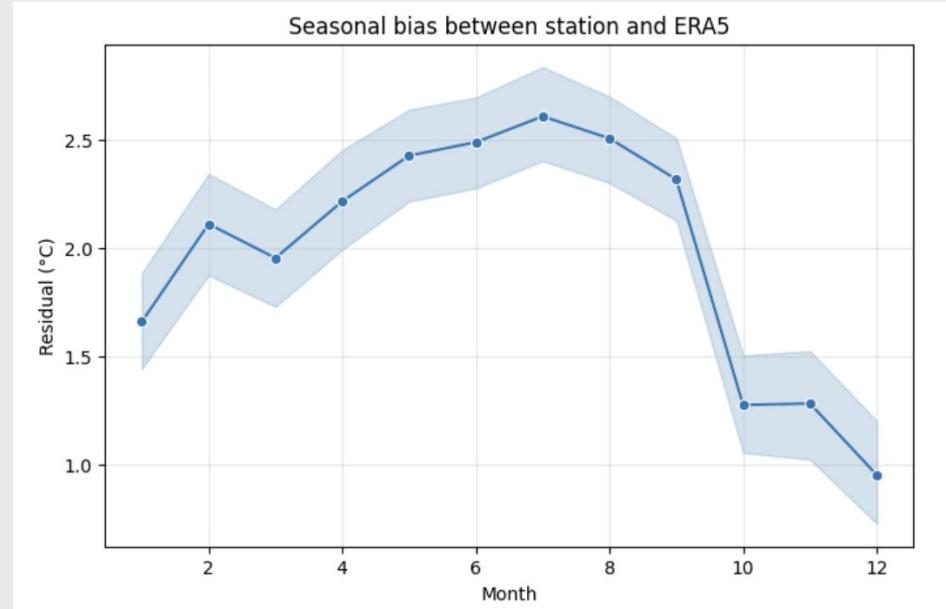
Seasonal Patterns Reveal Missing Urban Warming in Summer

The discrepancy between station data and ERA5 is strongly seasonal:

- ERA5 underestimates temperature year-round.
- Largest bias in summer ($+2.53^{\circ}\text{C}$) → strongest UHI + solar forcing.
- Moderate bias in spring ($+2.20^{\circ}\text{C}$).
- Lower bias in autumn ($+1.63^{\circ}\text{C}$) and winter ($+1.54^{\circ}\text{C}$).

| season | mean | std |
|--------|-------|-------|
| autumn | 1,633 | 2,679 |
| spring | 2,198 | 2,531 |
| summer | 2,534 | 2,368 |
| winter | 1,543 | 2,624 |

Seasonal pattern matches known UHI dynamics:
warm-season heat storage is not captured by coarse-grid reanalysis.



Impact of Vegetation on Temperature Prediction Error

Observations:

- Slight negative trend: higher NDVI → smaller error.
- Low vegetation areas (low NDVI): model often underestimates heat.
- High dispersion, especially around $\text{NDVI} \approx 0.65\text{--}0.70$.

Interpretation:

- Densely vegetated areas: errors close to 0°C .
- Low vegetation / urban areas: temperature underestimated.
- Suggestion: account for vegetation to improve the model.
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