## Developing satellite-derived nitrogen stable isotope ratio grids to globally monitor terrestrial plant nitrogen availability for 1984–2022

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**Abstract:** Nitrogen (N) availability regulates the productivity of terrestrial plants and the ecosystem services they provide. There is evidence for both increasing and decreasing plant N availability in different biomes, but the data are fragmentary. How plant N availability responds to climate change, N deposition and increasing atmospheric CO<sub>2</sub> concentration remains a major uncertainty in the projection of the terrestrial carbon sink. The foliar N stable isotope ratio ( $\delta^{15}$ N) is an indicator of plant N availability but its usefulness to infer long-term global patterns has been limited by data scarcity.

Combining ground-based  $\delta^{15}N$  and Landsat spectra, we derived annual global maps of Landsat-based foliar  $\delta^{15}N$  as estimates of plant N availability during 1984–2022 using a random forest ensemble learning method. The model consistently achieved low error (NRMSE < 0.2) across continents and biomes. We found significant decreases in plant N availability for 44% and increases for 16% of vegetated Earth's surface with large spatial heterogeneity. Plant N availability mostly declined in woody-dominated ecosystems but increased in herbaceous-dominated ones. These  $\delta^{15}N$  trends were consistently and negatively correlated with the trends of Normalised-Difference-Vegetation-Index as they varied across ecosystems, suggesting increasing plant cover could have led to decreasing plant N availability. Our results indicate possible future reductions in plant N availability in many terrestrial ecosystems and provide a useful way to monitor those changes globally.

Keywords: Plant nitrogen availability, reflectance, vegetation monitoring