

study includes parameterizing the wavelet-smoothed time series to identify crop types. We foresee the ability to use other types of time series in this wavelet method of analysis (WFPCP), such as fractions of green vegetation from Spectral Mixture Analysis.

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