

# Quantifying longitudinal microstructural tissue changes in MS lesions with a unified metric derived from multiparametric quantitative MRI

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## INTRODUCTION

Advanced quantitative MRI (qMRI) provides tissue-specific measures sensitive to microstructural changes, such as myelin and axonal damage [1]. While different qMRI modalities highlight complementary pathological features within white matter lesions (WMLs) in MS, integrating them to track tissue changes over time remains challenging.

## OBJECTIVES

To develop a unified voxel-wise method that integrates longitudinal qMRI data to characterize microstructural changes in WML and surrounding tissue, and assess its relevance via associations with chronic inflammation, neurodegeneration, and disability accumulation.

## METHODS

**Study population:** We studied 41 people with MS from the INsIDER Basel cohort, who underwent a 3T MRI at 2 timepoints. Clinical and MRI details available in Table 1.

Sex	Age (mean±SD)	Disease duration (mean±SD)	EDSS (median[range])	cEDSS/y (mean±SD)
26F + 15M	45.23±14.83 years	9.87±11.68 years	2.0[0.0, 6.5]	0.08±0.29
qMRIs	cMRIs	Follow up (mean±SD)		
T1map, QSM, MWF	T1w, FLAIR	2.00±0.07 years		

Table 1. Data information. Abbreviations: myelin water fraction (MWF), quantitative susceptibility mapping (QSM), annualized EDSS change (cEDSS/y), conventional MRI (cMRI), standard deviation (SD).

**Data processing:** After identifying WMLs on FLAIR and black holes (BH) on T1w, external portion (EP) and perilesional tissue (PT) regions were segmented (Figure 1). Paramagnetic Rim Lesions (PRLs) were identified using Chimap/phase imaging. Brain atrophy was quantified via percentage brain volume change (PBVC) using FSL SIENA tool [2].

**Mahalanobis map:** A novel map that captures multiparametric microstructural abnormalities over time was generated by computing Mahalanobis distance in qMRI change maps between lesions and a reference region (Figure 2). The Mahalanobis distance can be interpreted as the Euclidean distance where differences are weighted according to the covariance of the data. The higher the distance from the reference region distribution (i.e., the higher abnormality), the higher the magnitude of the Mahalanobis map.

**Statistics:** To evaluate differences across lesion regions, generalized linear mixed-effect models were used, with covariates adjustment (age, sex, follow up interval, lesion volume), mean Mahalanobis distance as dependent variable, region as regressor and subject as random factor. The same model was applied to assess differences in chronic inflammation state (PRL vs non-PRL) and to evaluate associations with brain atrophy or disease accumulation, with PBVC or cEDSS/y as regressors, respectively.

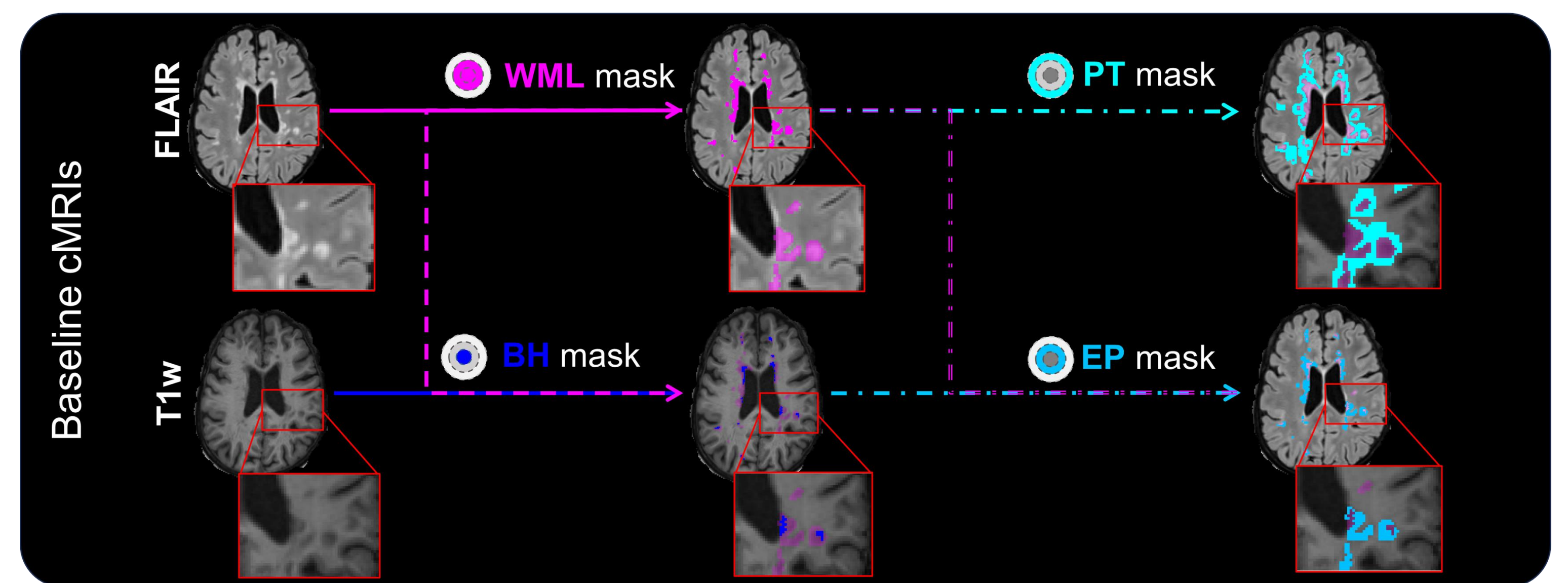


Figure 1. Lesion regions identification scheme. First, WML mask was identified segmenting FLAIR-hyperintensities. Then T1w-hypointensities in WML mask were identified as black hole (BH) region. Finally, external portion (EP) was defined as the region between BH and lesion edge, while peri-lesional tissue (PT) region as 2 mm-ring beyond lesion edge.

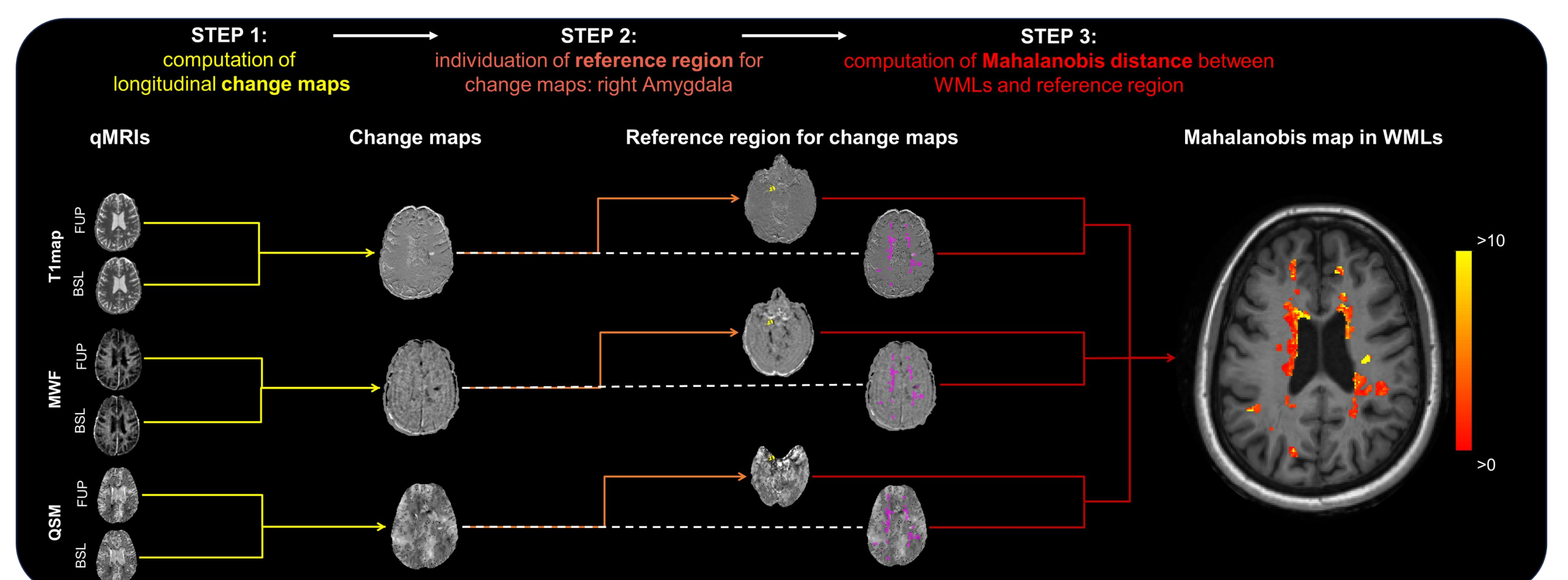


Figure 2. Longitudinal microstructural abnormality mapping scheme. Step 1) computation of longitudinal (BSL: baseline, FUP: follow up) change maps from qMRIs. Step 2) Individuate the most time-invariant anatomical region common to all sequences. Step 3) compute Mahalanobis distance in change maps between WMLs voxels and the reference region distribution.

## RESULTS

A total of 804 WMLs with BH were analysed, of which 71 (9%) PRLs. When considering all WMLs, Mahalanobis maps revealed an “inside-out” gradient of microstructural abnormalities, with the highest values in BH and decreasing in EP and PT (mean:4.8±6.7, 3.1±3.3, 1.2±1.5 respectively,  $p < 0.01$ ; WML: 3.3±3.5) (Figure 3A). PRLs had higher Mahalanobis values than non-PRLs within BH and EP ( $p < 0.01$ ) (Figure 3B).

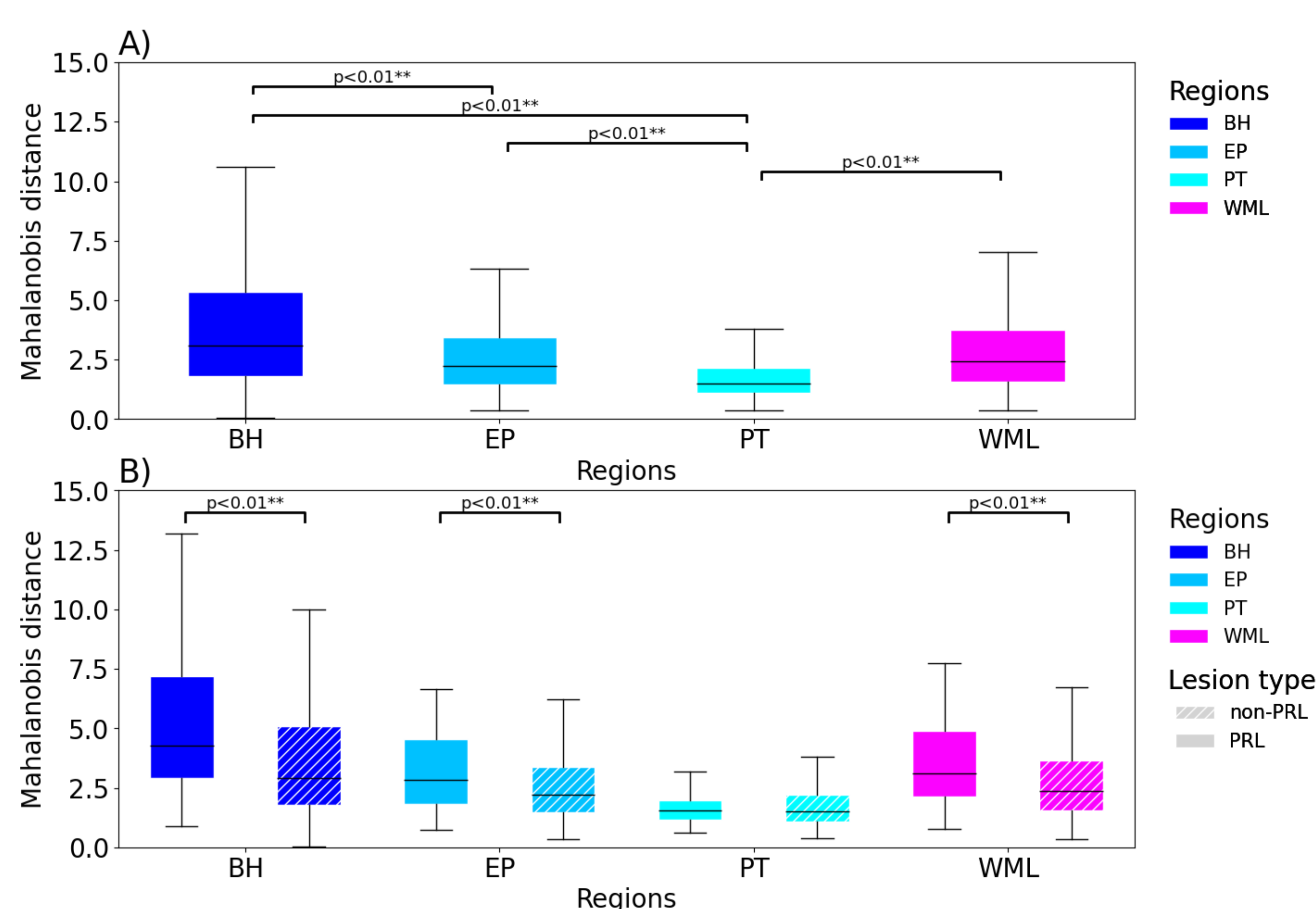


Figure 3. A) Boxplots of Mahalanobis distance in lesion regions unstratified (A) and stratified in PRLs and non-PRLs (B). Abbreviations: black hole (BH), external portion (EP), perilesional tissue (PT), white matter lesion (WML).

In PRLs only, higher Mahalanobis values were associated with lower PBVC (BH:  $b = -1.98$ ; EP:  $b = -0.98$ ; WML:  $b = -1.12$ ) (Figure 4). In non-PRLs, no associations with atrophy were found. In all lesion types, no associations with disability accumulation were found.

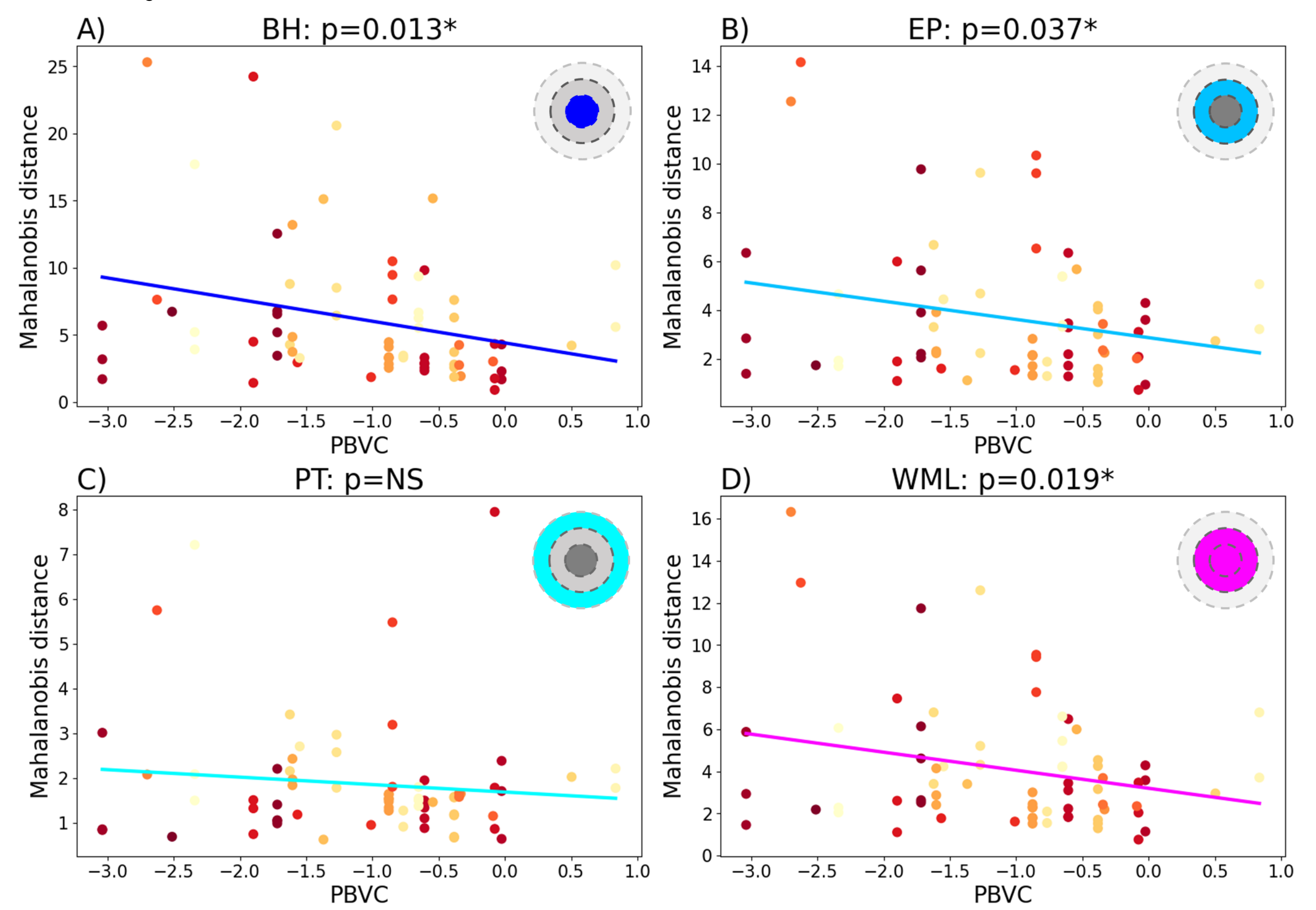


Figure 4. Scatter plot showing associations between PBVC (x axis) and Mahalanobis distance (y axis) in each WML region (A-C) and in WMLs (D). Each line represents the regression as obtained from the linear model, each dot correspond to a WML, and the color of dots indicate different subjects. Abbreviations: non-significant (NS), black hole (BH), external portion (EP), perilesional tissue (PT), white matter lesion (WML).

## CONCLUSIONS

Our novel multiparametric approach enables comprehensive mapping of microstructural changes across MS lesion compartments, particularly in chronic active lesions. By capturing distinct pathological signatures of abnormalities, it may provide new relevant markers of neurodegeneration as indicated by correlations with brain atrophy.

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## DISCLOSURES

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