

# Using spectral features to distinguish speakers with Parkinson's disease from typical speakers.

Slis, A.<sup>1</sup>, Fougeron, C.<sup>1</sup>, Pernon, M.<sup>1,2</sup> & Lancia, L.<sup>1</sup>

<sup>1</sup>LPP, UMR 7018, CNRS/U. Sorbonne-Nouvelle, Paris, France.

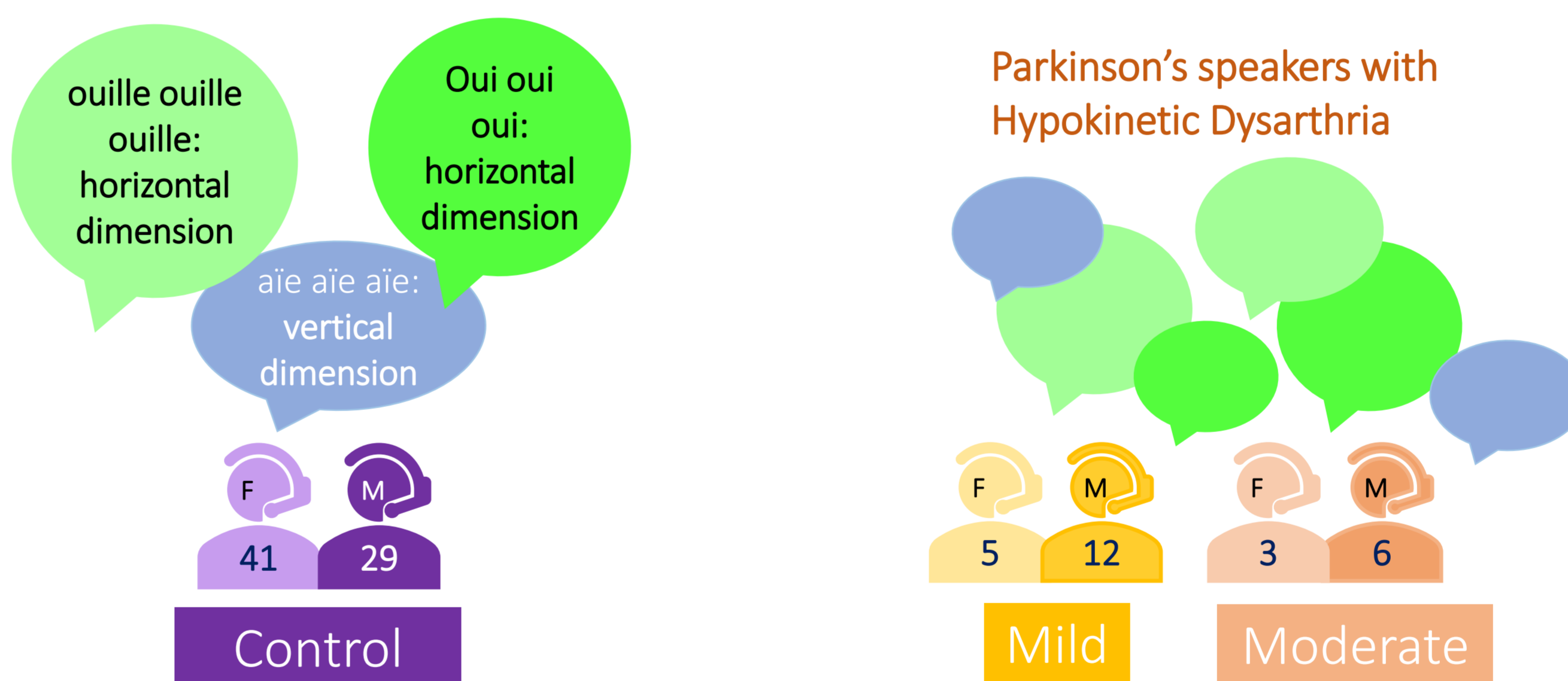
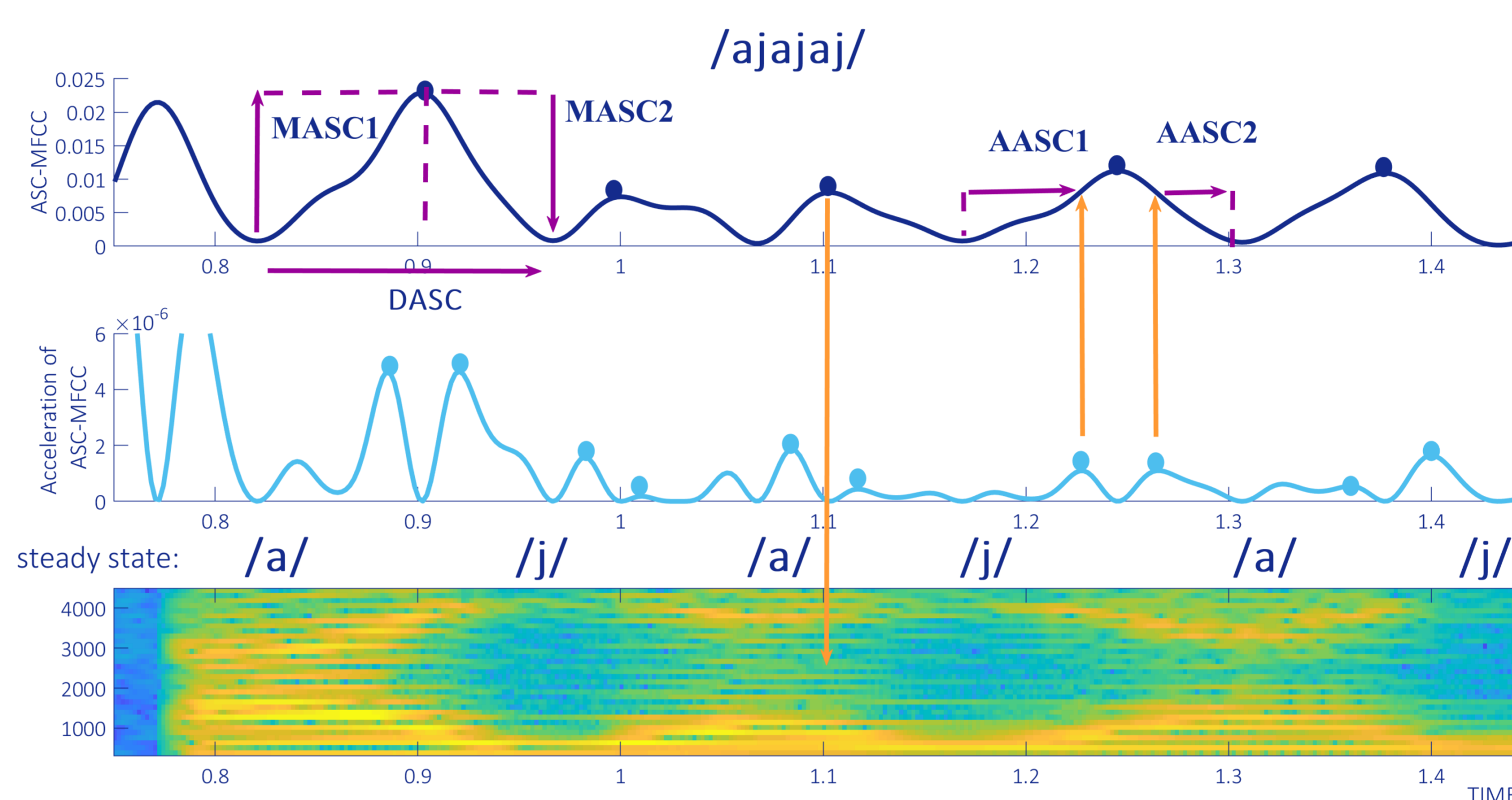
<sup>2</sup>Department of Clinical Neurosciences, Geneva University Hospital, Switzerland.

## Question

Can we separate dysarthric speakers with Parkinson's disease (PD) from typical speakers with an acoustic measure?

## Time course of Mel-Frequency Cepstral Coefficients (MFCC)

$$MFCC_k = \sum_{i=2}^{13} (f(i, k+1) - f(i, k))^2$$



## Background

In most cases, speakers with Parkinson's disease develop Hypokinetic dysarthria<sup>1</sup>:

- slower and smaller articulatory movements with reduced peak velocities of articulators<sup>2</sup>
- reduced F2 transitions<sup>2</sup>
- Smaller vowel space<sup>3</sup>

**Challenge acoustic studies:** Difficulty separating mild from moderate dysarthric speakers. Isolating formant curves is time consuming, susceptible to error, and ignoring important acoustic information caused by changes in vocal tract shape.

**Our study:** complete shape of the spectrum envelope and its patterns of change over time by extracting Mel-Frequency Cepstrum Coefficients (MFCC), which represent the changes in vocal tract shape<sup>4</sup>.

**Hypothesis:** analyzing the acoustic signal in terms of Mel Frequency Cepstral Components provides sufficient spectral information to separate the speech productions of people diagnosed with Parkinson's Disease (PD) from typical speakers.

**Participants:** speakers with mild and moderate dysarthria and control speakers produced vowel glide and glide vowel sequences (/ajajaj/, /ujujuj/ and /wiwiwi/ 4 times in separate trials and recorded.

## MFCC

- power spectra were calculated from the acoustic waveform on 25 ms windows, with 2 ms steps.
- a MEL filter bank was applied to these power spectra and the summed spectral energy in each band was calculated.
- Log-transform filterbank energies.
- Discrete Cosine Transformation (DCT).
- DCT coefficients 2-13 were considered.
- squared differences of cepstral energy values in consecutive frames were computed and summed at each time step (ASC\_MFCC; see figure), resulting in a contour.

## METRICS

**MASC1:** peak value of ASC\_MFCCs from minimum ASC\_MFCC (the steady state during the vowel) to the next maximum ASC\_MFCC (the point of highest spectral energy change, i.e., during the transition to the glide), the peak value of ASC\_MFCCs (MASC1) was computed.

**MASC2:** maximum to the next minimum (MASC2).

**DASC:** duration of the vowel-glide gesture from minimum to minimum (i.e., from steady state vowel to steady state glide

**AASC:** the derivative from the ASC\_MFCC curve (acceleration of the average squared change of the MFCCs) was calculated. From this curve, the time from a minimum ASC\_MFCC to a maximum acceleration peak (AASC1) and time from the maximum acceleration to a minimum ASC\_MFCC valley (AASC2) were computed.

## Results

**MASC1:** /wiwiwi/ showed decreasing MASC1 values in the order: healthy>PD\_MILD > PD\_moderate.

/ajajaj/ and /ujujuj/: moderate dysarthric PD differed from healthy speakers.

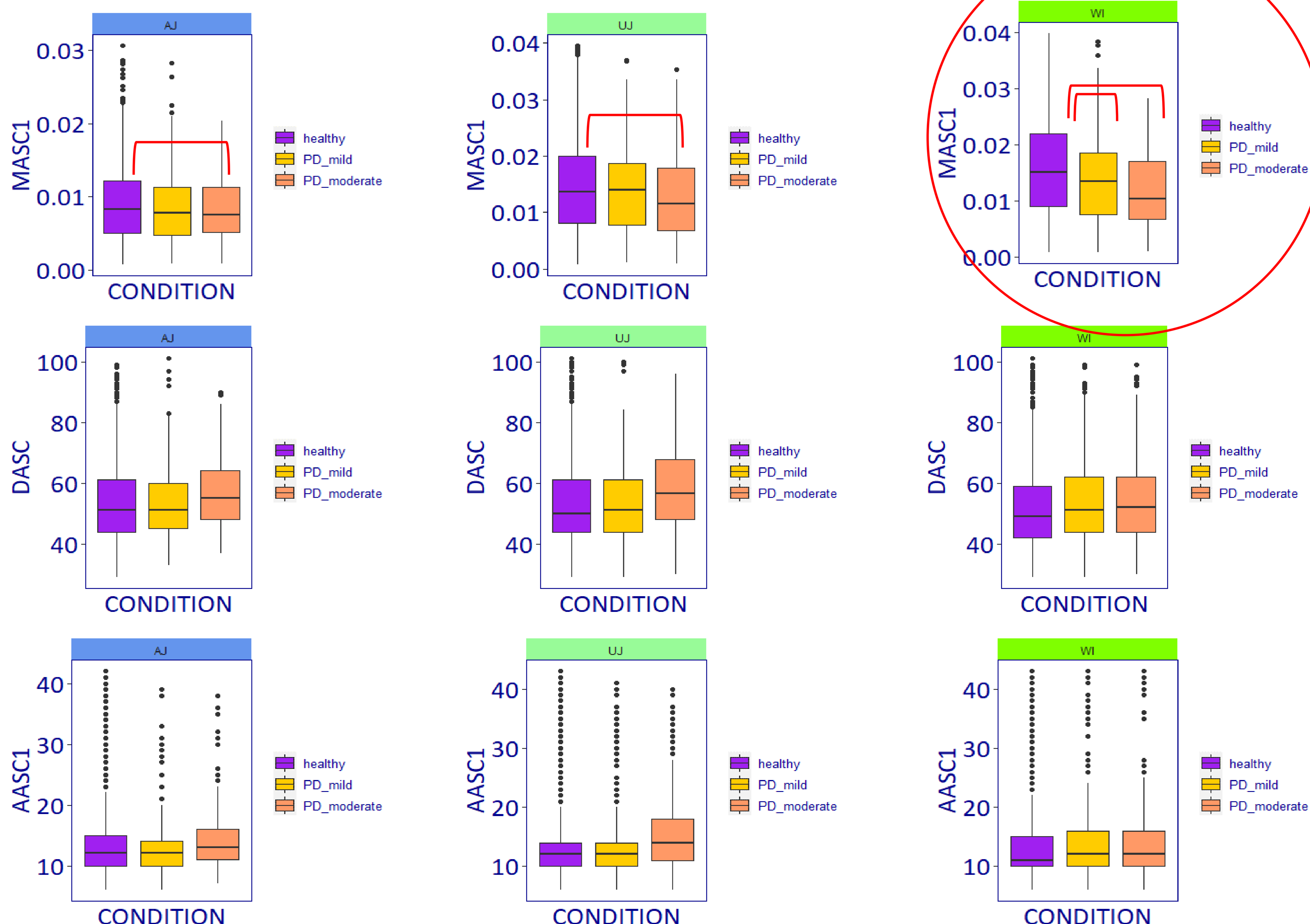
**DASC:** No significant differences

**AASC1:** No difference between the typical and the dysarthric speakers.

## Conclusions

1. Using ASC\_MFCCs as a tool to distinguish typical from atypical PD speech is promising.
2. The lower values for MASC1s characterizing the PD speakers suggest that the vocal tract changes are slower, especially for /wiwiwi/, which is consistent with the slower and smaller articulatory movements and reduced peak velocities of articulators, found in earlier kinematic studies<sup>2</sup> as well as the reduced F2 slopes and vowel space<sup>2,3</sup>.

It is speculated that PD speakers likely face more difficulties in changing the shape of the vocal tract to produce the contrasts of /wiwiwi/, which showed differences in the mild and moderate cases. Individuals with PD have been shown to experience perioral stiffness<sup>5</sup>, which potentially explains these results.



1) Duffy, J. R. (2005). *Motor speech disorders: Substrates, differential diagnosis, and management*. St. Louis, Mo: Elsevier Mosby.

2) Forrest, K., Weismer, G., & Turner, G. S. (1989). Kinematic, acoustic, and perceptual analyses of connected speech produced by Parkinsonian and normal geriatric adults. *The Journal of the Acoustical Society of America*, 85(6), 2608-2622. <https://doi.org/10.1121/1.397755>

3) Whitfield, J. A., & Goberman, A. M. (2014). Articulatory-acoustic vowel space: Application to clear speech in individuals with Parkinson's disease. *Journal of Communication Disorders*, 51, 19-28. <https://doi.org/10.1016/j.jcomdis.2014.06.005>

4) Goldstein, L. (2019). The role of temporal modulation in sensorimotor interaction. *Frontiers in Psychology*, 10, 2608. <https://doi.org/10.3389/fpsyg.2019.02608>

5) Caligiuri, M. P. (1987). Labial kinematics during speech in patients with parkinsonian rigidity. *Brain: A Journal of Neurology*, 110(4), 1033-1044. <https://doi.org/10.1093/brain/110.4.1033>