

# Automatic Frequency Band Selection for BCIs with ERDS Difference Maps



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## Introduction

- Band power discriminates motor imagery (MI) tasks [1]
- ERDS maps visualize task related changes in band power [2]
- **New algorithm:** band selection based on image segmentation [3]
- Mimics an expert inspecting ERDS maps
- Performance compared to manual band selection by an expert

## Methods

### ERDS Difference Maps:

- Difference between two ERDS maps (Figure 2)
- Find significant areas (Figure 1)
- Results in ERDS Difference map (Figure 2-D)
- Not limited to ERDS: any measure in the t/f-plane (Figures 4, 5)

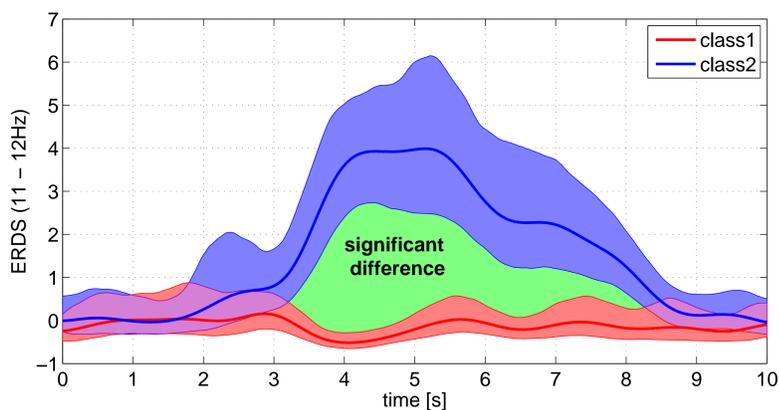


Figure 1: Significant difference for a single frequency band.

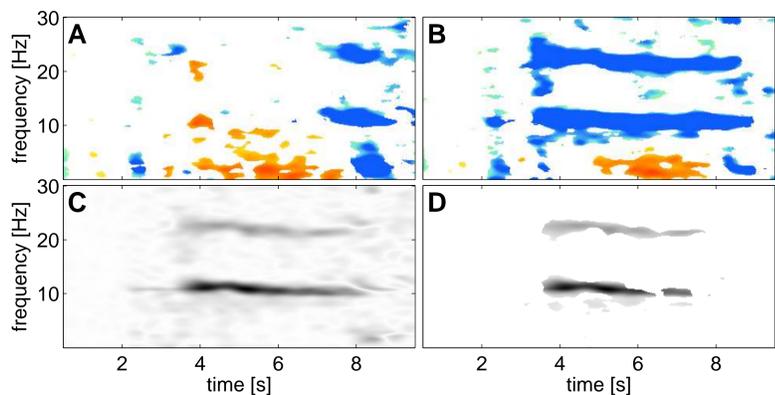


Figure 2: Processing steps of the ERDS Difference algorithm. (A) ERDS map for class 1. (B) ERDS map for class 2. (C) Difference of A and B. (D) Significant differences.

### Automatic Frequency Band Selection:

1. Small significant spots removed by area-opening [3] (Figure 3-B)
2. Define one frequency band for each remaining area (Figure 3-C)
3. Merge overlapping frequency bands (Figure 3-D)

### Comparing Automatic and Manual Band Selection:

- Left vs. right hand MI data from 18 participants [4]
- Three channels (C3, Cz, C4), avg. number of trials:  $167 \pm 44$  SD
- Manual and automatic band selection performed using ERDS maps
- Classification Accuracy on unseen data compared by paired *t*-test

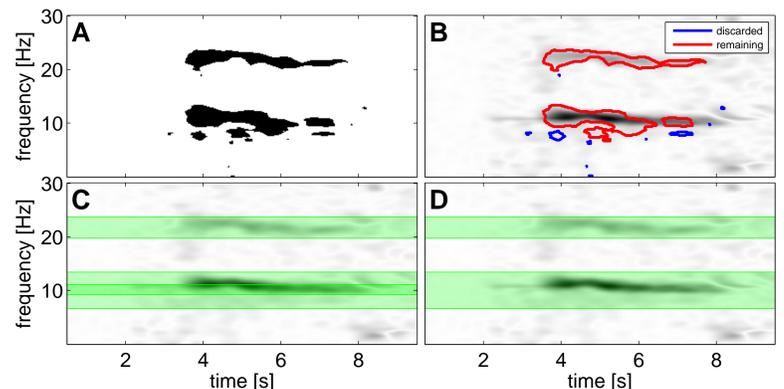


Figure 3: Processing steps of the band selection algorithm. (A) Significance map. (B) Rejection of small significant areas. (C) Selected frequency bands. (D) Merged overlapping frequency bands.

## Results

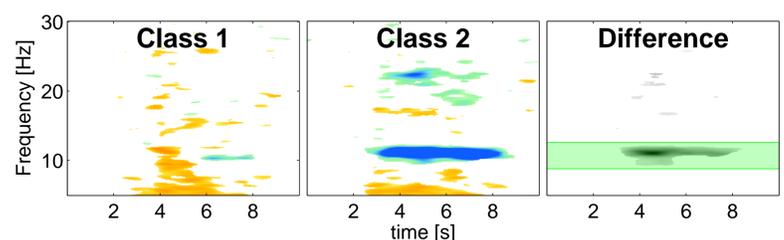


Figure 4: Automatic frequency band selection applied to ERDS maps. Electrode position C4, left and right hand MI.

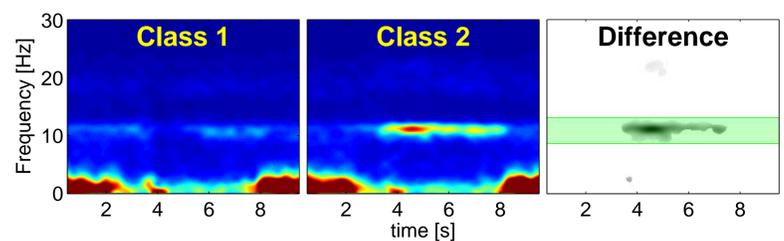


Figure 5: Automatic frequency band selection applied to FFT power maps. Electrode position C4, left and right hand MI.

### Comparing Automatic and Manual Band Selection:

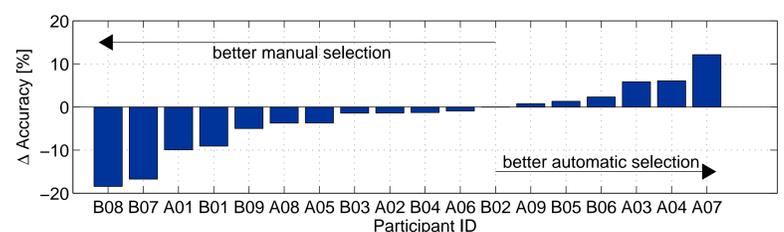


Figure 6: Differences in classification accuracy between automatic and manual band selection for each subject.

- Automatic accuracy:  $68.13\% \pm 13.49\%$  SD
- Manual accuracy:  $70.53\% \pm 14.51\%$  SD
- Paired difference:  $2.40\% \pm 7.61\%$  SD (*t*-test:  $p = 0.198$ )

## Conclusion

- Manual band selection slightly better than automatic selection
- However, **not significantly** so
- Difference too small to be evident in the data
- Small loss in classification accuracy may be acceptable

## References

- [1] G. Pfurtscheller and C. Neuper. Motor imagery and direct brain-computer communication. *Proceedings of the IEEE*, 89:1123–1134, 2001.
- [2] B. Graimann, J. E. Huggins, S. P. Levine, and G. Pfurtscheller. Visualization of significant ERD/ERS patterns in multichannel EEG and ECoG datas. *Clinical Neurophysiology*, 113:43–47, 2002.
- [3] S. T. Acton and N. Ray. Biomedical image analysis: Segmentation. *Synthesis Lectures on Image, Video, and Multimedia Processing*, 4(1):1–108, 2009.
- [4] BCI Competition 2008 - Graz data sets 2A and 2B. <http://www.bbci.de/competition/iv/>.

## Acknowledgements

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