











model of MI-BCI users' performances using their traits alone. Our results suggest that using only traits might not be sufficient to build such a model. Indeed, the between-session variability is high and seems to be multi-factorial. Further studies considering, for instance, an estimation of the users' states, the timing of the experiment and new metrics to assess performances are necessary to reveal more reliable models.

**Acknowledgments** This work was supported by the European Research Council with project BrainConquest (grant ERC-2016-STG-714567).

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