

2 **Title: EEG analysis of local sleep and its relation to lane departures**

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10 **Problem**

11 Historically, sleep has been considered a passive state but later it was proven to be an active dynamic
12 process. Until recently, sleep was also thought of as a global phenomenon, but it has now been found
13 that regions of the brain, at the local level of cortical columns and other neuronal assemblies, go silent
14 at different times. This is referred to as local sleep. Unlike microsleep, brief periods of local sleep may
15 occur when you are still entirely conscious and functioning (Hung et al., 2013; Vyazovskiy et al.,
16 2011). If local sleep is present in a brain structure that is currently needed to perform some task, this
17 will have a negative impact on task performance. In a driving setting, the consequences of local sleep
18 may be devastating.

19 The primary aim of this exploratory study is to investigate if local sleep (Ferrara & De Gennaro, 2011;
20 Hung et al., 2013), measured via EEG theta power in the 5 – 9 Hz frequency range in source localized
21 EEG recordings, can be related to lane departures and consequently to vehicle accidents. The question
22 at hand is whether local sleep can provide an explanation as to why it is sometimes possible to stay on
23 the road despite being severely sleepy while at other times it is not. Note that we do not envision our
24 results to be used in a potential application as an operational countermeasure for several reasons, the
25 most important being the requirement of an obtrusive high-quality multi-channel EEG. Instead, our
26 long term objective is to gain deeper knowledge and basic understanding of the physiological effects
27 underlying sleep related road crashes.

28
29 **Method**

30 Thirty participants were randomly selected from the register of vehicle owners. Each participant drove
31 in an advanced driving simulator at six different occasions, three occasions during daytime (between
32 12.30 and 21.15) and three occasions during night-time (between 22.00 and 06.15). Each occasion
33 consisted of three driving sessions (rural daylight scenario, rural darkness scenario and urban daylight
34 scenario). Every fifth minute during the 30-minute drives, the participants rated their sleepiness on the
35 Karolinska sleepiness scale (KSS).

36 A 30-channel EEG was recorded during the trials, and the source localized brain activity was
37 calculated using the standardized low resolution brain electromagnetic tomography (sLORETA)
38 algorithm (Pascual-Marqui, 2002). The data were then bandpass-filtered in the 5 – 9 Hz frequency
39 range to focus the analyses to the theta range which is of particular interest when investigating
40 sleepiness after extended wakefulness (Hung et al., 2013).

41 Conditional logistic regression with matching was used to test whether increased time-localized EEG
42 theta activity in a brain region increased the risk of having a lane departure. Here a lane departure is
43 defined as each occasion when half the vehicle is outside the lane. The lane departures were matched

44 with non-departures within the same individual to account for individual differences. To ensure that
 45 the lane departures were due to sleepiness, only lane departures when the drivers reported KSS = 9
 46 were used. The lane departures and matching non-departures were used as a binary outcome variable
 47 and EEG theta content in eighteen brain regions were used as explanatory variables. A stepwise
 48 conditional logistic regression was used to derive a combined model relating several brain regions to
 49 lane departures.

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51 Results

52 The results are based on 135 lane departures matched with corresponding non-departures, all from
 53 drivers reporting a sleepiness level of KSS = 9. The regression resulted in a model with a significant
 54 simultaneous effect of the superior frontal cortex and the precentral cortex on lane departures relative
 55 to non-departures (*Likelihood ratio test* = 25.42, $p = 3.023 \cdot 10^{-6}$). Including additional brain
 56 regions in the model does not improve its performance. The estimated $\hat{\beta}$ coefficients, the odds ratios,
 57 the standard errors and the z-scores are shown in Table 1. The estimated odds ratio for a lane departure
 58 relative to a non-departure was 1.48 in the precentral region and 1.60 in the superior frontal region.
 59 This means that for every unit increase in EEG theta power in these two regions, the odds for
 60 departing the road increase with 1.48 and 1.60, respectively.

61 Table 1: Results from the conditional logistic regression using the best combination of brain regions.

Region	$\hat{\beta}$	OR	SE ($\hat{\beta}$)	z	p
Precentral	0.391	1.478	0.142	2.74	0.006
Superior frontal	0.468	1.596	0.206	2.27	0.02

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64 Discussion

65 Regions in which the EEG theta power increased significantly before a lane departure were especially
 66 the precentral and superior frontal cortex. The precentral cortex is associated with the primary motor
 67 functions and the superior frontal cortex integrates with the sensory system and regulates intellectual
 68 function and action, and is associated with motor planning, regulation and organization. This result
 69 intuitively makes sense, i.e. that an inability to stay on the road is related to motor function and
 70 movement organization. Analogous to the performance degradations associated with local sleep in
 71 awake rats (Vyazovskiy et al., 2011), our results indicate that an increased theta content in regions
 72 associated with motor control is associated with lane departures. This may explain why it is sometimes
 73 possible to stay on the road despite feeling sleepy, while at other times the same level of sleepiness
 74 leads to a lane departure. In both situations, it is obviously important to stop the vehicle and take a
 75 rest.

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77 Summary

78 The results indicate a relationship between lane departures and increased local theta activity in brain
 79 regions associated with motor function. However, the exploratory nature of this study, along with the
 80 fact that we have investigated the effect of local sleep rather than local sleep per se, prompts for
 81 further validation of the results.

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83 **References**

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