

# Automatic Sleep-Wake Stage Scoring using Artificial Neural Networks: Optimisation and Comparison of two Systems

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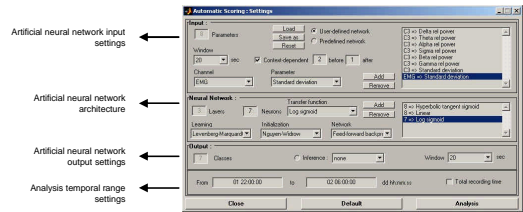
In human and animal, artificial neural networks have shown satisfying performance as compared to human experts in sleep-wake stage scoring analysis of polysomnographic (PSG) recordings (1-2). To date, the few available analysis systems cannot be used with any recordings because they have been developed using fixed parameters. These parameters consist in the number, type (EEG ± EMG ± EOG) and sampling rate of signals required, the recording device and digital file format used for data storage, as well as the number of sleep-wake stages to be determined.

A new software system for off-line polygraphic reviewing and analysis (3; **PRANA**, PhiTools, Strasbourg, France) has been developed under MATLAB (The MathWorks, Natick, USA). This environment, which supports virtually any recording systems, serves as a basis for developing and testing new analysis and detection algorithms since it allows incorporating user software plug-ins. By doing so we have developed an automatic sleep-wake stage scoring analyser allowing to configure, learn and simulate artificial neural network classifiers. In its original version this automatic analyser software plug-in showed a global agreement of 74±7 and 80±1% in scoring healthy human and rat recordings, respectively (4).

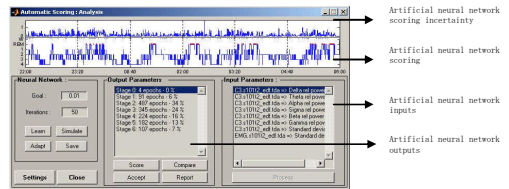
**Objective:** The aim of this study was to optimise the **PRANA** software automatic analyser plug-in for healthy human sleep-wake recordings and to compare its performance to that of another commercially available system (**BioSleep v3.0 Oxford BioSignals, Oxford, Royaume-Uni**). The parameters taken into account in the optimisation process were the use of a consensual multi-individual learning database, on one hand, and the introduction during simulation of a contextual dependency, on another hand.

**Material & Methods:** Nocturnal PSG recordings performed in 13 young adult healthy volunteers were interpreted independently by two experts (ES and AB) according to the standard R&K criteria (5), then submitted to automatic analysis by the two compared systems. Global and intra-class agreement (specificity) and error (sensitivity) between experts and automatic systems were determined and evaluated using Cohen's kappa statistics (6).

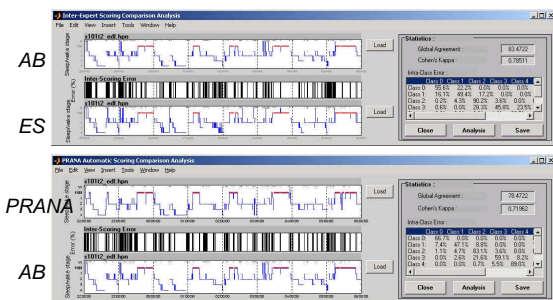
**Results:** Comparison of the two systems against the experts indicate better performances for the **PRANA** system than for **BioSleep** (global agreement of 79.5±6.3 versus 46.2±8.7%). Intra-class agreements and errors are represented in the accompanying figure.



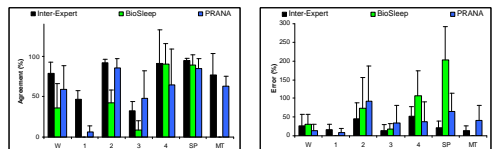
Settings interface of the PRANA software automatic sleep-wake stage scoring plug-in.



Scoring interface of the PRANA software automatic sleep-wake stage scoring plug-in.



Scoring comparison interface of the PRANA software automatic sleep-wake stage scoring plug-in.



Intra-class agreement and error (mean±SEM) of two automatic analysis systems (PRANA and BioSleep) compared to the analysis of two experts.

**Conclusion:** A global performance of the **PRANA** system just below inter-expert agreement (82.8±3.3%) suggest the use of the system at the sleep lab.

The **PRANA** software automatic sleep-wake stage scoring plug-in, by allowing to configure, learn and simulate various type of artificial neural network classifiers, may represent a convenient tool to speed up human and animal sleep research.

Since it allows incorporating user software plug-ins, the **PRANA** software system, which supports virtually any recording systems, may serve as a basis for developing and testing new analysis and detection algorithms.

**References:** (1) Schaltenbrand et al., *Sleep* 19(1):26-35, 1996. (2) Robert et al., *J Neurosci Methods* 79(2):187-93, 1998. (3) Tung and Oxenford, *The MathWorks newsletter*, Spring 2001. (4) Becq et al., 16<sup>ème</sup> Congrès de la SFRS, 2001. (5) Rechtschaffen and Kales, *US Government Printing Office*, 1968. (6) Cohen, *Educ Psychol Meas* 20:37-46, 1960.