Letter to the Editor

Pilot Study Results Assessing the Accuracy of a Ballistic Sleep Monitor Relative to Polysomnography in Parkinson's Disease

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Sleep disturbance is the most prevalent non-motor symptom in Parkinson's disease (PD), affecting over 90% of individuals [1], and associating with increased fall frequency, impulsive behavior, and cognitive dysfunction [2, 3]. While sleep disturbance typically worsens as the disease progresses [3], some conditions, such as REM sleep behavior disorder (RBD), may present decades before a clinical diagnosis [2]. Therefore, better understanding of sleep disturbances in PD may improve symptom management, as well as facilitate disease detection in the prodromal stage when disease modifying treatments may be most effective [2].

Polysomnography (PSG) is the gold-standard sleep assessment; however, the associated equipment may cause a significant departure from the usual night's sleep. In addition, PD is characterized by fluctuations and variability so assessment of a single night may fail to capture the spectrum of sleep alterations [4], potentially leading to missed opportunities for intervention and an incomplete understanding of sleep disturbance in PD. Digital devices afford continuous home monitoring and the large-scale data may generate new signatures of health and disease [5]. Despite potential advantages, progress has been hampered by methodological variability and insufficient validation [6]. Of the few studies comparing digital devices to PSG in PD, most have used actigraphy and have reported moderate correlations with wide variability [7]. Therefore, the goal of the present pilot study was to compare the accuracy of a bal-

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	5	Summary Metrics		
	PSG	Device	p, Effect size	Bias (Lower,
	Mean \pm SD	Mean \pm SD	(95% CI)	Upper LOAs)
Total sleep time, min	231 ± 102	343 ± 51	$p = 0.001^*, 2.36$	112 (3, 220)
			(0.64, 4.07)	
Sleep efficiency, %	58 ± 25	86 ± 3	$p = 0.031^*, 1.34$	23 (-2, 49)
			(0.56, 2.11)	
Light sleep duration, min	337 ± 140	196 ± 27	$p < 0.001^*, -3.67$	-150 (-265, -34)
			(-6.73, -0.62)	
Deep sleep duration, min	3 ± 8	61 ± 17	<i>p</i> < 0.001*, 4.95	59 (19, 98)
			(0.27, 9.64)	
REM sleep duration, min	44 ± 52	86 ± 21	$p = 0.021^*, 0.98$	39 (-34, 111)
			(0.12, 1.83)	
Mean heart rate	62 ± 10	60 ± 8	p = 0.057, 0.04	0.7 (-5, 7)
			(-0.11, 0.19)	
		EBE Analysis		
PSG Stage	Sensitivity	Specificity	Accuracy	Kappa
	(95% CI)	(95% CI)	(95% CI)	value
Wake	15 (12, 18)	96 (94, 98)	67 (60, 75)	0.64
Light sleep	57 (52, 62)	53 (47, 57)	55 (50, 59)	0.12
Deep sleep	28 (-11, 51)	83 (80, 86)	82 (80, 85)	0.76
REM sleep	31 (25, 38)	78 (76, 80)	75 (72, 78)	0.61

 Table 1

 Group level comparisons of automated summary metric and epoch-by-epoch analyses of the ballistic sleep monitor relative to polysomnography

*p < 0.05. Differences between PSG and sleep monitor device were assessed with paired samples *t*-test or Wilcox test. Bias (95% CIs) and upper and lower LOAs were analyzed using Bland-Altman plots. EBE analysis cells indicate the percentage of epochs that the device correctly or incorrectly classified relative to PSG. PSG, polysomnography; SD, standard deviation; 95% CI, 95% confidence interval; LOA, limits of agreement; min, minutes; REM, rapid eye movement.

listic sleep monitor relative to PSG among adults with early-stage PD using standardized analytic procedures [8].

Participants were recruited from Department of Neurology at the University of Texas Health San Antonio. Inclusion criteria included 1) Age 18-88 years; 2) Clinical diagnosis of idiopathic early-stage PD (Hoehen & Yahr Stage 1-2); 3) A study partner capable of providing collateral sleep information; 4) In-home broadband internet and a smart phone. Exclusion criteria included 1) Active/current insomnia; 2) Use of a CPAP or BiPAP; 3) Untreated sleep apnea (self-report or STOP-BANG score >2 [9]); 4) Untreated restless legs syndrome; 5) Body mass index $>40 \text{ kg/m}^2$; 6) Current sedative-hypnotic medication use; 7) Current alcoholism or drug abuse; 8) Diagnosed dementia or Montreal Cognitive Assessment score <19 [10]. Twenty participants enrolled in the study. Concurrent data from the ballistic sleep monitor was unavailable on 12 participants due to issues with data downloads and the manual resetting of devices. The study was conducted in adherence with The Code of Ethics of the World Medical Association and the protocol was approved by the local institutional review board. Participants provided written informed consent prior to enrollment.

The first visit consisted of history and physical examination, cognitive assessments, and questionnaires. RBD symptoms were assessed with the Mayo Sleep Questionnaire [11]. An in-clinic overnight PSG was conducted and sleep stages were scored using the Academy of Sleep Medicine Manual for Scoring of Sleep Studies and Associated Events v2.6 by a registered sleep technologist [12]. During the PSG, a ballistic sleep monitor (Emfit QS, Emfit Corp., Kuopio, Finland) was placed under the mattress at thoracic level [13, 14]. An electromechanical film sensor detects pressure changes associated with respiration and heart rate, which are used to derive sleep stage estimation using algorithms previously validated against simultaneously collected electrocardiogram and respiratory inductive plethysmography [15].

Demographic and clinical characteristics were assessed using descriptive statistics. Sleep analyses were conducted using standardized guidelines and open-source R code by Menghini et al. [8]. Sleep staging and summary metrics derived from the ballistic sleep monitor and PSG were compared using paired sample's *t*-tests or Wilcoxon signed rank tests. Light sleep was derived as the sum of N1 and N2. Biases of the device relative to PSG were assessed using Bland-Altman plots with 95% confidence intervals (CI). Epoch-by-epoch (EBE) analyses of thirty second periods were performed following temporal synchronization of the device with the PSG. Grouplevel accuracy, sensitivity, and specificity for sleep staging with 95% CIs were calculated. Statistical analyses were performed using R v4.2.2 and all tests were two-sided with statistical significance set at p < 0.05.

Eight participants (mean age 66 ± 8 years, 25%female) were included in the study. The average PD diagnosis duration was 2.7 ± 2.9 years. Five participants endorsed RBD (62.5%) and seven (87.5%) were prescribed levodopa. During the PSG, two participants did not achieve REM sleep and five did not achieve Stage 3 sleep. Relative to PSG, the device's algorithm overestimated total sleep time (TST), sleep efficiency (SE), and deep and REM sleep duration, while underestimating light sleep duration (Table 1). Similarly, stratified analyses indicated the device overestimated TST, SE, and deep sleep in both RBD and non-RBD groups (all p < 0.05). EBE analyses indicated relatively high specificity, while sensitivity was consistently poor. The accuracy of the sleep stage discrimination ranged from 55 to 82 with the lowest levels observed for light sleep duration and the highest for deep sleep duration. Our findings are similar to a prior validation study using this device in a convenience sample of adults undergoing PSG, which reported accuracies ranging from 55 to 78 [13].

In summary, our pilot study provides novel data demonstrating the accuracy of a ballistic sleep monitor relative to PSG among individuals with early-stage PD. The sensitivity and accuracy of the device were poor with overestimation of TST, SE, and deep and REM sleep duration, as well as underestimation of light sleep duration. Primary limitations of the study included the small sample and sizable data loss, which may contribute to bias. Future studies with larger samples and well-matched control groups are necessary to confirm the findings. Overall, the results highlight the importance of validating digital devices against gold-standard PSG within individuals with PD prior to implementation within clinical settings.

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CONFLICT OF INTEREST

Dr. Gonzales has personal stock in Abbie. Ms. Pollet and her spouse are employed by Academy Diagnostics Sleep and EEG Center. Dr. Seshadri has consulted for Eisai and Biogen outside the current work. All other authors report no disclosures.

DATA AVAILABILITY

The dataset is available on reasonable request by qualified researchers by contacting the corresponding author.

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