

SLEEPJ, 2023, 1–16

https://doi.org/10.1093/sleep/zsab299 Advance Access Publication Date: 4 January 2022 Original Article

# Original Article

# Automatic analysis of muscular activity in the flexor digitorum superficialis muscles: a fast screening method for rapid eye movement sleep without atonia

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# Abstract

Study objectives: To identify a fast and reliable method for rapid eye movement (REM) sleep without atonia (RWA) quantification.

Methods: We analyzed 36 video-polysomnographies (v-PSGs) of isolated REM sleep behavior disorder (iRBD) patients and 35 controls' v-PSGs. Patients diagnosed with RBD had: i) RWA, quantified with a reference method, i.e. automatic and artifact-corrected 3-s Sleep Innsbruck Barcelona (SINBAR) index in REM sleep periods (RSPs, i.e. manually selected portions of REM sleep); and ii) v-PSG-documented RBD behaviors. We quantified RWA with other (semi)-automated methods requiring less human intervention than the reference one: the indices proposed by the SINBAR group (the 3-s and 30-s phasic flexor digitorum superficialis (FDS), phasic/"any"/ tonic mentalis), and the REM atonia, short and long muscle activity indices (in mentalis/submentalis/FDS muscles). They were calculated in whole REM sleep (i.e. REM sleep scored following international guidelines), in RSPs, with and without manual artifact correction. Area under curves (AUC) discriminating iRBD from controls were computed. Using published cut-offs, the indices' sensitivity and specificity for iRBD identification were calculated. Apnea-hypopnea index in REM sleep (AHI<sub>REN</sub>) was considered in the analyses.

**Results:** RWA indices from FDS muscles alone had the highest AUCs and all of them had 100% sensitivity. Without manual RSP selection and artifact correction, the "30-s phasic FDS" and the "FDS long muscle activity" had the highest specificity (85%) with AHI<sub>REM</sub> < 15/h. RWA indices were less reliable when AHI<sub>REM</sub> >15/h.

Conclusions: If AHI<sub>REM</sub><15/h, FDS muscular activity in whole REM sleep and without artifact correction is fast and reliable to rule out RWA.

#### Statement of Significance

This study shows that, independently from the method used, automatically quantified rapid eye movement (REM) sleep without atonia (RWA) in the flexor digitorum superficialis muscles (FDS) alone can better discriminate patients with and without isolated REM sleep behavior disorder from controls compared to automatic RWA quantified in the mentalis/submentalis muscle alone. Furthermore, the study shows that automatic quantification of RWA in the FDS muscles alone, without manual selection of REM sleep periods nor artifact correction, is useful and reliable to rule out RWA when apnea-hypopnea index in REM sleep is below 15/h. Routine recording of FDS muscular activity in clinical practice will allow ruling out of RWA and make diagnostic procedures faster.

Key words: FDS; RBD; REM sleep without atonia; RWA; SINBAR; upper extremities

Submitted: 10 September, 2021; Revised: 18 November, 2021

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#### Introduction

Rapid eye movement (REM) sleep behavior disorder (RBD) is a parasomnia characterized by loss of muscle atonia during REM sleep and dream enactment [1]. Isolated RBD (iRBD, i.e. RBD not associated with any other disease/condition) constitutes the early stage of an alpha-synucleinopathy (i.e. Parkinson's disease, dementia with Lewy bodies, and multiple system atrophy) [2]. According to the third edition of the International Classification of Sleep Disorders (ICSD-3) [1], demonstration of rapid eye movement (REM) sleep without atonia (RWA) is necessary to establish the diagnosis of RBD. Various manual [3-8] and automatic/ semi-automatic [9-18] methods to score RWA have been validated. While most of the proposed methods to score RWA use the chin (i.e. mentalis or submentalis) electromyography (EMG) signal alone, the Sleep Innsbruck Barcelona (SINBAR) group has shown that combining muscular activity in the mentalis and bilateral upper extremities (i.e. flexor digitorum superficialis (FDS)) muscles increases diagnostic accuracy for RBD [6,19,20]. Because of this and of the extensive further validations of the method [6,20-22], the SINBAR montage has been reported in the ICSD-3 as the most current evidence-based method to quantify RWA [1] and recently recommended by international guidelines [23].

The manual quantification of RWA according to the SINBAR recommendations is a time-consuming process. Among the attempts made to automatize RWA scoring [9–18], the company OSG (www. osg.be) has developed, in collaboration with the Sleep Disorders Unit, Department of Neurology, Medical University of Innsbruck (Austria), the semi-automatic integrated BrainRT algorithm to score muscular activity in REM sleep according to the SINBAR recommendations, which has been previously validated [21]. Expert scorers manually identify portions of REM sleep where RWA should be quantified and the automatically identified muscular activities in these portions are manually corrected to remove artifacts, thus avoiding RWA over-quantification [21]. The semi-automated artifact-corrected SINBAR score has been previously used as reference method for RWA quantification in several studies [24–27].

Despite the semi-automatic procedure, the manual selection of the portions of REM sleep for RWA quantification and the manual artifact correction are time-consuming tasks. Therefore, RWA quantification is still cumbersome in everyday clinical practice and alternative faster but still reliable methods are needed. It has been recently shown that the mentalis EMG signal is particularly affected by artifacts and that the higher the apnea-hypopnea index in REM sleep ( $AHI_{REM}$ ), the higher is the number of artifacts that need to be manually removed in the mentalis muscle [26]. On the other side, it has been shown that FDS muscular activity is minimally affected by artifacts [21,26].

Based on these previous results, we hypothesized that automatically identified FDS muscular activity might be used as a first and fast PSG screening tool to either rule out or to confirm RWA and that it is more precise for this purpose than muscular activity automatically identified in the mentalis. In order to evaluate this hypothesis, the current study presents an analysis and comparison of the diagnostic accuracy of several automatic and semi-automatic RWA indices which require less human intervention than the semi-automatic artifact-corrected RWA quantification proposed by the SINBAR group. Indices are obtained from the FDS muscles alone, the mentalis/submentalis muscle alone, and their combination. The influence of AHI<sub>REM</sub> on the diagnostic accuracy of these indices is also investigated.

### Methods

#### Subjects

A total of 43 consecutive iRBD patients and 65 consecutive controls (i.e. patients referred to the sleep lab and who were diagnosed with other sleep disorders and did not have either isolated or secondary RBD) were investigated with one full-night video-polysomnography (v-PSG) at the Sleep Disorders Unit, Department of Neurology, Medical University Innsbruck, Austria [24]. Six iRBD patients underwent a second consecutive v-PSG night, as part of regular clinical investigations. Sleep diagnoses were made according to the ICSD-3 criteria [1] and quantification of RWA was performed in all participants with the semiautomated artifact-corrected 3-s SINBAR EMG activity index in REM sleep periods (RSPs, i.e. selected portions of REM sleep for RWA quantification), as described in Video-polysomnography. A subject was considered to have RWA if such index was exceeding the cut-off of 31.9%.[6] All iRBD patients had RWA over this cut-off and exhibited RBD behaviors during v-PSG.

Several exclusion criteria were defined for this retrospective study: i) age < 50 years (as iRBD is more frequent over 50 years, and this is also the population that would be most likely screened for risk of alpha-synucleinopathy once neuroprotective treatments will be available); ii) cumulative duration of RSPs < 10 minutes (see Video-polysomnography for the exact definition of RSPs); iii) electrical, gain saturation, other technical (such as loose or pulled cables) or ECG interference artifacts in either the mentalis, submentalis or in both FDS EMG channels in at least one REM sleep epoch (this strict criterion was defined to avoid any bias towards any of the RWA quantification methods described in RWA quantification with different automated and semi-automated methods); and iv) technical issues in importing v-PSGs in Matlab R2020b (which was used to implement some of the automatic RWA quantification methods described in RWA quantification with different automated and semi-automated methods). Figure 1 shows the details of how many subjects and v-PSGs were excluded from the initial cohort. The final cohort included 36 v-PSGs of 31 iRBD patients (i.e. five second-night v-PSGs were included) and 35 v-PSGs of as many controls. Of these controls, 25 had a diagnosis of sleep-disordered breathing with periodic limb movements during sleep (PLMS), three of sleep-disordered breathing, three of restless legs syndrome, and four of PLMS.

This retrospective study was approved by the ethical committee of the Medical University Innsbruck, Austria.

#### Video-polysomnography

V-PSG included recording of electroencephalography (EEG, with F3, F4, C3, C4, O1, O2, M1, and M2 electrodes), electrooculography (EOG, vertical and horizontal eye movements), EMG recorded at the mentalis (derivation ChinZ-Chin2, according to the American Academy of Sleep Medicine (AASM) manual [28]), submentalis (derivation Chin2-Chin1, according to the AASM manual [28]), bilateral FDS and bilateral tibialis anterior (TA) muscles, and cardiorespiratory signals (single lead electrocardiography (ECG), nasal airflow, tracheal microphone, thoracic and abdominal respiratory movements and transcutaneous oxygen saturation). EMG signals were recorded with sampling frequency of 1000 Hz. Sleep stages and respiratory events were



\*: one v-PSG with artifacts in mentalis and submentalis channels; one v-PSG with artifacts in submentalis channel.

\*: one v-PSG with artifacts in mentalis channel; one v-PSG with artifacts in mentalis and submentalis channels; one v-PSG with artifacts in submentalis channel.

Figure 1. Overview of how many subjects and v-PSGs were excluded from the initial cohort. The different exclusion criteria are reported together with how many subjects and v-PSGs were excluded. *Legend*: iRBD: isolated REM sleep behavior disorder; REM: rapid eye movement; v-PSG: video-polysomnography.

manually scored according to international criteria [28]. PLMS were scored with a validated software [29].

For each v-PSG, RWA was quantified with the validated artifact-corrected semi-automated BrainRT software according to the SINBAR criteria in 3-s mini-epochs included in RSPs [21], following the steps here explained.

First, an expert scorer (AS, blinded to sleep diagnoses) manually selected RSPs in REM sleep on the basis of 3-s miniepochs. A RSP started at the beginning of the first 3-s miniepoch including a rapid eye movement and continued until the end of the 3-s mini-epoch occurring right before a miniepoch including a sleep spindle, K-complex, and/or EEG signs of arousals or after three consecutive minutes without rapid eye movements [3,6]. Figure 2 and Supplementary Figure S1 in the Supplemental Material present an example of start and end of a RSP, respectively. As an example, for the specific patient shown in Figure 2 and Supplementary Figure S1, a total of 194 30-s epochs of REM sleep (i.e. 1h37m) were scored according to the international guidelines [28] and 14 RSPs were manually identified with the method described above. The selected RSPs had a length varying from 42s (i.e. 14 3-s miniepochs) to 19m42s (i.e. 394 3-s mini-epochs). The cumulative length of the RSPs for this patient was 1h26m03s (i.e. 1721 3-s mini-epochs).

After manual selection of 3-s mini-epochs, EMG signals were then filtered between 50 Hz and 300 Hz and the BrainRT software was run to identify phasic, tonic, and "any" muscular activity in the mentalis muscle and phasic activity in the FDS muscles in REM sleep according to the SINBAR criteria [6,21].

Finally, expert scorers (AH and EH, blinded to sleep diagnoses) visually checked the automatically scored activations in the EMG channels included in RSPs and performed manual artifact correction, which consisted in the manual removal of activations generated by e.g. technical issues, respiration, snoring, ECG, which were not recognized as muscular activity to be considered for RWA quantification [6,21]. The artifact-corrected (AC) 3-s SINBAR EMG activity index in RSPs (SINBAR<sub>3s,RSP,AC</sub>) was calculated as the percentage of 3-s mini-epochs included in RSPs with "any" mentalis and/or phasic activity in the left and/or right FDS muscles, after manual artifact correction. A subject was considered to have RWA if such index was above 31.9% [6].

# RWA quantification with different automated and semi-automated methods

In order to investigate our hypothesis, we computed RWA with different automatic and semi-automatic methods requiring less human intervention and being therefore less time-consuming than the reference method (i.e.  $\textsc{SINBAR}_{\scriptscriptstyle 3s, \textsc{RSP}, AC}$  ). The indices were calculated considering FDS muscular activity alone, mentalis/ submentalis muscle activity alone, and their combination. The quantification was performed both in manually selected RSPs as well as in whole REM sleep (i.e. REM sleep scored in 30-s epochs according to international recommendations [28]) and with/ without manual artifact correction. With this approach, we could compare the diagnostic performances of different automated and semi-automated RWA quantification methods considering muscular activity in different muscles. Despite TA muscular activity is routinely recorded during v-PSGs, we did not quantify RWA in the TA muscles, as it has been shown that TA muscular activity is less specific for RWA compared to FDS and mentalis muscles [6-8].

RWA indices according to SINBAR recommendations in REM sleep periods. As previously described, the BrainRT software was used to score phasic, "any" and tonic activity in the mentalis muscle and phasic activity in the FDS muscles. Expert scorers performed artifact correction (see Video-polysomnography). The software was programmed to identify "any" and tonic activities only in the mentalis muscle and not in the submentalis one, as the mentalis is the derivation recommended by the AASM [28]. For each subject, we calculated the following RWA indices:

- 3-s phasic mentalis EMG activity index with (phasic-M<sub>3s,RSP,AC</sub>) and without artifact correction (phasic-M<sub>3s,RSP</sub>): the percentage of 3-s mini-epochs in RSPs with phasic mentalis EMG activity, before and after manual artifact correction, respectively.
- 3-s "any" mentalis EMG activity index with (*any*-M<sub>3s,RSP,AC</sub>) and without artifact correction (*any*-M<sub>3s,RSP</sub>): the percentage of 3-s mini-epochs in RSPs with "any" mentalis EMG activity, before and after manual artifact correction, respectively.
- 30-s tonic mentalis EMG activity index with (tonic-M<sub>305,RSPAC</sub>) and without artifact correction (tonic-M<sub>305,RSP</sub>): the percentage of complete 30-s REM sleep epochs included in RSPs scored as tonic, before and after manual artifact correction, respectively.
- 3-s phasic FDS EMG activity index with (phasic-FDS<sub>33,RSP,AC</sub>) and without artifact correction (phasic-FDS<sub>33,RSP</sub>): the percentage of 3-s mini-epochs in RSPs with phasic FDS EMG activity, before and after manual artifact correction, respectively. If one FDS channel had electrical, gain saturation, other technical or ECG artifacts, only the other one was used to obtain the phasic-FDS<sub>38,RSP</sub> index.
- 3-s SINBAR EMG activity index with (SINBAR<sub>35,RSP,AC</sub>) and without artifact correction (SINBAR<sub>35,RSP</sub>): the percentage of 3-s mini-epochs in RSPs with "any" EMG activity in the mentalis muscle and/or phasic EMG activity in at least one FDS muscle,



Figure 2. Example of start of a REM sleep period. The REM sleep periods selected for quantification of RWA are shown in blue and it can be seen that they are portions of REM sleep. The start of a REM sleep period is set at the beginning of the first 3-s mini-epoch where a rapid eye movement is present. *Legend*: EOG-H-L: left horizontal electrooculogram (EOG); EOG-H-R: right horizontal EOG; EOG-V-U: vertical upper EOG; EOG-V-D: vertical lower EOG; Neck-L: splenius capitis muscle left; Neck-R: splenius capitis muscle; Subment: submental EMG; ECG: electrocardiogram; FDS-L: left flexor digitorum superficialis (FDS) muscle; FDS-R: right flexor digitorum superficialis muscle; TIB-L: left anterior tibialis muscle; TIB-R: right anterior tibialis muscle; Cann: cannula; Thor: thorax; Abd: abdomen; Mic: microphone; EMG: electromyogram; REM: rapid eye movement; RWA: REM sleep without atonia.

before and after manual artifact correction, respectively. In the case one FDS channel had electrical, gain saturation, or other technical artifacts, only the other one was used to obtain the  $SINBAR_{3_{S,RSP}}$  index. The  $SINBAR_{3_{S,RSP,AC}}$  index was used as reference method to quantify RWA (see Participants).

RWA indices according to SINBAR recommendations in whole REM sleep. When considering whole REM sleep (i.e. REM sleep scored according to international guidelines [28]), the SINBAR group has validated cut-offs for RWA indices calculated on the basis of 30-s REM sleep epochs [6]. The automatically scored phasic, "any", and tonic activity in the mentalis and phasic activity in the FDS muscles without manual artifact correction were used to compute the RWA indices described below.

- 30-s phasic mentalis EMG activity index (phasic-M<sub>30s,REM</sub>): the percentage of 30-s REM sleep epochs with at least five 3-s mini-epochs with phasic mentalis EMG activity.
- 30-s "any" mentalis EMG activity index (any-M<sub>30s,REM</sub>): the percentage of 30-s REM sleep epochs with at least five 3-s miniepochs with "any" mentalis EMG activity.
- 30-s tonic mentalis EMG activity index (tonic-M<sub>30s,REM</sub>): the percentage of 30-s REM sleep epochs scored as tonic.
- 30-s phasic FDS EMG activity index (*phasic-FDS*<sub>305,REM</sub>): the percentage of 30-s REM sleep epochs with at least five 3-s mini-epochs with phasic activity in the left and/or right FDS EMG signal. In case of electrical, gain saturation, other technical or ECG artifacts in one FDS channel, only the other one was used for computation.
- 30-s SINBAR EMG activity index (SINBAR<sub>30s,REM</sub>): the percentage of 30-s REM sleep epochs which had at least five

3-s mini-epochs with "any" and/or phasic activity in the left and/or right FDS muscles. Also in this case, in presence of electrical, gain saturation, other technical or ECG artifacts in one FDS muscle, only the other one was used for analysis.

The indices were calculated only without manual artifact correction, because semi-automated artifact-corrected indices in 30-s epochs have not been validated against manual scoring [21]. Manual artifact correction is likely more challenging when scoring RWA in 30-s epochs, due to the inclusion of muscular activity related to arousals, which is automatically excluded from RSPs. For this reason, we did not include artifact-corrected indices in 30-s epochs.

REM atonia index. The REM atonia index (RAI), proposed by Ferri et al.[9,10], is an automatic measure quantifying the level of atonia ranging from 0 (no atonia) to 1 (complete atonia). RAI calculated in the submentalis muscle has been extensively validated to measure RWA and to identify patients with RBD [7-10,30,31]. To calculate RAI for an EMG signal, the following steps are performed [9,10]: i) the EMG signal is filtered between 10 and 100 Hz and a notch filter at 50 Hz is applied; ii) the signal is rectified; iii) the signal is divided in 1-s windows for which the average rectified EMG amplitude is calculated; iv) from each 1-s window average rectified EMG amplitude, the minimum EMG amplitude found in a moving window including the 60 surrounding windows is subtracted, thus obtaining a noise-corrected average rectified EMG amplitude for each 1-s window; v) RAI is calculated as the ratio between the percentage of 1-s windows with noise-corrected average rectified EMG amplitude  ${\leq}1\mu V$  and the percentage of 1-s windows with noise-corrected average rectified EMG amplitude  ${\leq}1\mu V$  or >2  $\mu V$ .

In this work, we implemented this algorithm in Matlab R2020b and we derived the following RAI values for each subject:

- RAI mentalis in RSPs (RAI-M<sub>RSP</sub>) and in whole REM sleep (RAI-M<sub>REM</sub>): the RAI calculated for the mentalis muscle, considering the signal included in RSPs and in whole REM sleep, respectively.
- RAI submentalis in RSPs (RAI-SM<sub>RSP</sub>) and in whole REM sleep (RAI-SM<sub>REM</sub>): the RAI calculated for the submentalis muscle, considering the signal included in RSPs and in whole REM sleep, respectively.
- RAI FDS in RSPs (RAI-FDS<sub>RSP</sub>) and in whole REM sleep (RAI-FDS<sub>REM</sub>): RAI was calculated for both FDS muscles, considering the signals included in RSPs and in whole REM sleep, respectively. The indices were calculated as the average RAI value across the two muscles if both were not affected by saturation or other technical artifacts. In case of one of the two muscles had electrical, gain saturation, other technical or ECG artifacts, only the other muscle was considered.

Short and long muscle activity indices. Mayer et al. proposed an automatic method to identify short (<0.5s) and long (≥0.5s) muscular activity during REM sleep [11]. The short and long muscle activity indices (SMI and LMI, calculated as the frequency of short and long muscle activity per hour of REM sleep, respectively) have been validated for the mentalis and FDS muscles as measures of RWA to identify patients with RBD [11,12]. To automatically score short and long muscular activity in one EMG signal, the following steps are performed [11]: i) the EMG signal is filtered between 10 Hz and 120 Hz; ii) the smoothed (0.025 s) lower and upper envelopes of the EMG signal are obtained; iii) the amplitude signal is calculated as the difference between the upper and lower envelopes; iv) the amplitude signal is smoothed over 200 s with a moving window; v) the threshold curve is obtained as twice the smoothed amplitude signal; vi) muscle activity is identified when the amplitude signal exceeds the threshold curve and clusters of muscle activity at distance <1 s are merged; vii) SMI is calculated as the number of short muscle activity (i.e. with duration <0.5s) per hour of REM sleep and LMI as the number of long muscle activity (i.e. with duration  $\geq$ 0.5s) per hour of REM sleep.

In this work, we implemented the algorithm in Matlab R2020b and calculated the following values for each subject:

- Indices for the mentalis muscle: short and long muscular activities were identified in the mentalis muscle. The SMI-M<sub>RSP</sub>, LMI-M<sub>RSP</sub>, and their combination (SMI&LMI-M<sub>RSP</sub>) were calculated in RSPs as the number of short, long, and any (i.e. short and long) muscle activity in the mentalis muscle per hour of sleep included in RSPs, respectively. Similarly, these indices were calculated also in whole REM sleep (SMI-M<sub>REM</sub>, LMI-M<sub>REM</sub>, and SMI&LMI-M<sub>REM</sub>).
- Indices for the submentalis muscle: short and long muscular activities were identified in the submentalis muscle. The SMI (SMI-SM<sub>RSP</sub>), LMI (LMI-SM<sub>RSP</sub>), and their combination (SMI&LMI-SM<sub>RSP</sub>) were calculated in RSPs as the number of short, long, and any (i.e. short and long) muscle activity in the submentalis muscle per hour of sleep included in RSPs, respectively. Similarly, these indices were calculated also in whole REM sleep (SMI-SM<sub>REM</sub>, LMI-SM<sub>REM</sub>, and SMI&LMI-SM<sub>REM</sub>).

• Indices for the FDS muscles: muscle activities were identified separately for the left and right FDS muscles and then merged to calculate in RSPs the SMI (SMI-FDS<sub>RSP</sub>), LMI (LMI-FDS<sub>RSP</sub>), and their combination (SMI&LMI-FDS<sub>RSP</sub>) as the number of short, long, and any (i.e. short and long) muscle activity per hour of sleep included in RSPs, respectively. In case of electrical, gain saturation, other technical or ECG artifacts in one FDS muscle, only the other one was used to compute these indices. Similarly, these indices were calculated also in whole REM sleep (SMI-FDS<sub>REM</sub>, LMI-FDS<sub>REM</sub>, and SMI&LMI-FDS<sub>REM</sub>).

# Evaluation of the discrimination power of the RWA indices

For each RWA index, we compared with Mann-U-Whitney tests the values obtained for iRBD patients and controls. Furthermore, for each index, we obtained the receiver operating characteristic curve (ROC) and calculated the area under the curve (AUC) to evaluate its discrimination power to distinguish iRBD patients from controls. These analyses were done for all v-PSGs, as well as for only the v-PSGs with  $AHI_{REM} < 15/h$  and the ones with  $AHI_{REM} \geq 15/h$ . DeLong's test was used to statistically compare the AUC values obtained for the different indices [32,33]. Benjamini-Hochberg procedure was used to correct *p*-values for multiple comparisons (false discovery rate set at 0.05). ROCs, AUCs computations, and DeLong's tests were performed with an open-source Matlab user interface [32,34].

Previous studies have proposed cut-offs to identify RWA for the following indices: phasic mentalis EMG activity index (16.3% for 3-s mini-epochs included in RSPs and 10.6% for 30-s REM sleep epochs in whole REM sleep) [6], "any" mentalis EMG activity index (18.2% for 3-s mini-epochs included in RSPs and 14.5% for 30-s REM sleep epochs in whole REM sleep) [6], tonic mentalis EMG activity index (9.6% for 30-s REM sleep epochs included in RSPs and 8.7% for 30-s REM sleep epochs in whole REM sleep) [6], phasic bilateral FDS EMG activity index (16.8% for 3-s miniepochs included in RSPs and 7.7% for 30-s REM sleep epochs in whole REM sleep) [6], SINBAR EMG activity index (31.9% for 3-s mini-epochs included in RSPs and 27.2% for 30-s REM sleep epochs in whole REM sleep) [6], RAI in the submentalis muscle (0.8 and 0.9) [10], SMI in the mentalis muscle (90.1/h) [12], LMI in the mentalis muscle (43.1/h) [12], SMI in the FDS muscles (124.3/h) [12] and LMI in the FDS muscles (50.1/h) [12]. Using these cut-offs, we calculated the sensitivity and specificity of these RWA indices for identifying iRBD patients in our study sample. The analysis was done for all v-PSGs, and separately for the v-PSGs with  $AHI_{REM} < 15/h$  and the ones with  $AHI_{REM} \ge 15/h$ .

# Results

#### Cohort

The demographic and sleep information of the cohort are shown in Table 1, where they are reported for all v-PSGs and separately for v-PSGs with  $AHI_{PFM} < 15/h$  and with  $AHI_{PFM} \geq 15/h$ .

#### **RWA** indices

The RWA indices are reported in Table 2. When considering all v-PSGs and v-PSGs with  $AHI_{REM}$ <15/h, all RWA indices of iRBD

	All v-PSGs			V-PSGs with AHI <sub>REM</sub> <15	/h		V-PSGs with AHI <sub>REN</sub>	<sub>4</sub> ≥15/h	
Parameter	Cont.	iRBD	p-val	Cont.	iRBD	p-val	Cont.	iRBD	p-val
Number of v-PSGs	35	36	I	20	27	I	15	6	1
Number of subjects	35	31	I	20	23	I	15	6	I
Males/Females	24/11	28/3	.031	13/7	22/1	.010	11/4	7/2	.808
Age (years)	62 [59–68]	69 [59–73]	.056	63.5 [59–70.5]	70 [62–73]	.116	62 [58–66]	69 [57–75]	.420
Number of patients	9	15	.007	4	10	.101	2	5	.028
under antidepressants									
TIB (min)	486 [473–503]	482.5 [470.5-498]	.850	480 [460.5–504]	484 [469–498]	.438	489 [478.5–501]	481 [475–490]	.371
TST (min)	400 [332–439]	415.5 [376.5-443.5]	.367	389 [312.5–429]	412 [378-442]	.208	415 [348.5-450]	419 [361–455.5]	.905
SPT (min)	472 [440–489]	464 [447–484]	.800	468 [430.5–489]	464 [447–486]	669.	476 [463–488.5]	459 [448–481]	.404
Sleep efficiency (%)	83.6 [71.4–90.1]	85.0 [76.2–89.8]	.361	82.8 [67.7–89.8]	85.0 [75.8–89.4]	.420	83.6 [75.9–90]	85.6 [77.3–94.3]	.493
%W (%SPT)	13.9 [8.7–24.1]	11.7 [5.8–17.6]	.154	14.7 [8.8–27.6]	10.8 [6.1–18.7]	.263	11.7 [8.6–20.7]	13.3 [4.8–14.1]	.283
%N1 (%SPT)	14.2 [10.2–20.3]	13.0 [9.1–17.8]	.543	11.2 [8.5–17.3]	13.1 [9.2–17.9]	.445	16.5 [13.2–27.3]	11.6 [8.6–16.1]	079.
%N2 (%SPT)	40.0 [35.9-48.8]	49.0 [35.5–57.7]	.034	41.1 [36.0–46.7]	50.7 [35.4–57.5]	.124	38.6 [30.9–54.4]	45.0 [41.2–61.3]	.190
%N3 (%SPT)	7.6 [5.7–17.1]	8.4 [2.8–14.7]	.267	12.6 [6.6–22.5]	8.2 [2.8–11.5]	.022	6.5 [2.8–13.6]	14.6 [4.9–17.1]	.387
%REM (%SPT)	14.1 [9.0–19.0]	14.9 [9.7–19.0]	.683	13.3 [9.8–18.6]	15.2 [10.8–20.3]	.471	15.4 [8.3–19.3]	14.4 [8.3–17.3]	.676
REM (min)	65.0 [40.4–91.6]	72.0 [44.8–88.8]	.641	60.0 [42.2–87.6]	72.0 [45.4–97.2]	.349	74.0 [40.0–93.4]	64.0 [42.7–83.0]	.592
AHI (/h)	11.1 [4.2–29.0]	6.9 [3.1–11.7]	.049	2.1 [1.7–11.4]	4.8 [2.5–9.5]	.154	38.1 [21.0–55.9]	11.2 [8.2–23.8]	.037
$AHI_{REM}$ (/h)	10.1 [1.5–36.0]	6.7 [2.2–15.8]	.345	1.3 [0-6.5]	3.1 [1.2–9.1]	.165	45.3 [27.3–54.6]	22.7 [18.3–32.2]	079.
PLMS index (/h)	19.0 [7.8–46.5]	27.6 [14.2–68.4]	.218	18.2 [8.6–64.5]	36.0 [13.5–70.3]	.378	21.5 [7.3–30.8]	25.0 [15.5–31.9]	.592
# of manually selected	959 [532–1157]	989 [474–1221]	.863	986 [663–1251]	958 [468–1175]	.683	778 [440–1116]	1024 [763–1290]	.551
3-s mini-epochs in REM									
sleep periods									
Cumulative length REM	48.0 [26.6–57.9]	49.5 [23.7–61.0]	.863	49.3 [33.2–62.6]	47.9 [23.4–58.8]	.683	38.9 [22.0–55.8]	51.2 [38.2–64.5]	.551
sleep periods (min)									
SINBAR <sub>3s,RSP,AC</sub> (%)	15.7 [9.0–22.2]	63.9 [52.9–74.5]	<.001	11.9 [8.9–16.1]	63.6 [52.9–73.0]	<.001	22.0 [16.6–28.3]	68.4 [52.3–79.8]	<.001
The values are reported as medi number of patients under antid, AC: artifact-corrected; AHI: aptue disorder; N1: non-REM sleep sta; REM: rapid eye movement sleep; TST: total sleep time; v-PSC: vide	an and [25 <sup>th</sup> percentil <i>a-7</i> epressants. For these two ta-hypopnea index, AH <sub>W</sub> ge 1; N2: non-REM sleep f. RSP: REM sleep period; t. RSP: and sleep period; eo-polysomnography, W.	<sup>5th</sup> percentile] Mann-U-Wh o variables, Fisher exact tes: <sub>ma</sub> : apnea-lypopnea index i stage 2; N3: non-REM sleep SINBAR: Sleep Innsbruck Bi st wakefulness.	itney tests w ts were used n REM sleep; stage 3; <i>p</i> -va arcelona; SP7	ere used to compare all varia . Significant <i>p</i> -values (<.05) an . Cont: controls; IRBD: patient . Dont: prunds; Priodic lim . sleep period time; TIB: time ` sleep period time; TIB: time	bles, except sex distribution e highlighted in bold. s with isolated REM sleep b h movements during sleep; in bed;	and ehavior			

Table 1. Demographic and sleep information of the cohort investigated in the study

patients were always significantly higher compared to the ones of controls. When considering v-PSGs with AHI<sub>REM</sub>≥15/h, the values of RWA indices including the FDS muscles were always significantly higher for iRBD patients compared to controls. In contrast, many indices obtained for the mentalis/submentalis muscles alone (i.e. *phasic-M*<sub>35,RSP</sub>, *any-M*<sub>35,RSP</sub>, *tonic-M*<sub>305,REP</sub>, RAI-M<sub>RSP</sub>, LMI-SM<sub>RSP</sub>, LMI-SM<sub>RSP</sub>, *phasic-M*<sub>305,REM</sub>, *any-M*<sub>305,REM</sub>, *tonic-M*<sub>305,REM</sub>, *RAI-M*<sub>REM</sub>, RAI-SM<sub>REM</sub>, and LMI-SM<sub>REM</sub>, where not significantly different between iRBD and controls for v-PSGs when AHI in REM sleep was ≥15/h.

#### AUC values

The values of AUC obtained from the ROC curves to distinguish iRBD patients from controls are reported in Table 3 and shown in Supplementary Figure S2. The *p*-values obtained by using DeLong's test to compare AUCs are shown in Figure 3, when considering all v-PSGs, and in Supplementary Figures S3 and S4 when considering v-PSGs with  $AHI_{REM} < 15/h$ , respectively. The  $SINBAR_{3s,RSP,AC}$  index, being the reference method used for quantifying RWA and diagnosing RBD, had always AUC of 1.000, per definition. Detailed analyses of the AUC values are reported below.

All  $\nu$ -PSGs. All RWA indices obtained from the FDS muscles alone (except SMI) had significantly higher AUC values compared to the vast majority of RWA indices calculated including the mentalis/submentalis muscles alone (Figure 3). The SINBAR<sub>305,REM</sub> indices had significantly higher AUC values than most of the indices calculated from the mentalis/submentalis muscles alone. Thus, when considering all v-PSG, RWA indices calculated from FDS muscle only allowed to have significantly better discrimination between iRBD patients and controls than RWA indices obtained from the mentalis/submentalis muscle only.

*v*-PSGs with AHI<sub>REM</sub><15/h. The indices obtained from the FDS muscles and the non-artifact corrected SINBAR indices had very high values of AUCs (ranging from 0.987 to 1.000). However, despite the RWA indices obtained from the FDS muscles alone had higher AUC values compared to all RWA indices calculated from the mentalis/submentalis muscle, no significant difference was observed (Supplementary Figure S3). The same was observed for both the non-artifact corrected SINBAR indices. This indicates that, for v-PSG with AHI in REM <15/h, all RWA indices have similar discrimination power.

*v*-PSGs with AHI<sub>REM</sub>≥15/h. Supplementary Figure S4 shows that some RWA indices obtained from the FDS muscles alone (i.e. *phasic*-FDS<sub>36,RSPA</sub>, *phasic*-FDS<sub>36,RSP</sub>, LMI-FDS<sub>REP</sub>, SMI&LMI-FDS<sub>REP</sub>, *phasic*-FDS<sub>306,RSP</sub>, LMI-FDS<sub>REM</sub>) and Significantly higher AUC values than some of the RWA indices calculated from the mentalis/ submentalis muscles alone (i.e. *phasic*-M<sub>368,RSP</sub>, RAI-M<sub>RSP</sub>, *phasic*-M<sub>306,REM</sub>, RAI-M<sub>REM</sub>, RAI-SM<sub>REP</sub>, RAI-SM<sub>REM</sub>), Only SMI calculated in the FDS muscles alone had lower AUC values than the same indices calculated in the mentalis/submentalis muscles (Table 3). The SINBAR<sub>368,RSP</sub> index had significantly higher AUC value compared to *phasic*-M<sub>368,REP</sub>, *phasic*-M<sub>306,REM</sub>, RAI-SM<sub>RSP</sub>, LMI-SM<sub>RSP</sub>, and RAI-SM<sub>REM</sub> (Supplementary Figure S4). The SINBAR<sub>306,REM</sub> had significantly higher AUC value than only *phasic*-M<sub>306,REM</sub> and RAI-SM<sub>RSP</sub> (Supplementary Figure S4). Therefore, in case of AHI in REM above 15/h, only some indices using FDS muscular activity allow to distinguish iRBD patients

from controls significantly better than indices calculated considering muscular activity in the mentalis/submentalis muscle alone.

Additional analyses. In the Supplemental Material (Section S1 and Supplementary Figure S5), additional analyses report: i) differences in AUCs between v-PSGs with  $\mathrm{AHI}_{\scriptscriptstyle\mathrm{REM}}{<}15/h$  and with  $AHI_{REM} \ge 15/h$ ; ii) difference in AUCs between the indices computed in RSPs and in whole REM sleep; and iii) differences in AUCs of the SINBAR indices with and without artifact correction. Briefly, such analyses show that: i) higher frequency of apneas and hypopneas in REM sleep generally reduces the discrimination power of RWA indices to identify iRBD patients, but the indices obtained from the FDS muscles alone are more robust than the ones obtained from the mentalis/submentalis muscles alone; ii) all RWA indices did not show significant difference in their discrimination power when computed in RSPs or in whole REM sleep; and iii) the discrimination power of the indices proposed by the SINBAR group did not change significantly when performing or not artifact correction.

#### Sensitivity and specificity

The values of sensitivity and specificity to identify iRBD patients obtained when using the previously proposed cut-offs are reported in Table 4 and shown in Supplementary Figure S6. The  $SINBAR_{35,RSP,AC}$  index, being the reference method used for diagnosis of RBD, had always sensitivity and specificity of 100%. Some detailed analyses are presented below.

Analysis of the performances of different RWA indices. The RWA indices obtained from the FDS muscles alone allowed identifying iRBD patients with 100.0% sensitivity. The specificity of these indices was noninferior to the one of the indices obtained from the mentalis/submentalis muscle alone. The only exception was observed for SMI-FDS<sub>RSP</sub> and SMI-FDS<sub>REM</sub> for v-PSGs with  $AHI_{REM}$  <15/h, which had both specificity of 70.0%, which was 10% lower than the lowest specificity of RWA indices obtained from the mentalis/submentalis muscle alone. Among the different RWA indices obtained from the FDS muscles alone, the phasic- $FDS_{30s REM}$  and the LMI-FDS<sub>REM</sub> (both obtained without manual selection of REM sleep periods and artifact correction) had specificity of 85.0% for v-PSGs with  $\mathrm{AHI}_{_{\mathrm{REM}}}\!\!<\!\!15/h.$  Thus, the phasic- $\text{FDS}_{\scriptscriptstyle 30s,\text{REM}}$  and the  $\text{LMI-FDS}_{\scriptscriptstyle \text{REM}}$  , which require only traditional scoring of REM sleep epochs, allowed to identify with high sensitivity and specificity iRBD patients with AHI in REM sleep lower than 15/h.

Both non-artifact corrected SINBAR indices had also 100% sensitivity. For the one calculated in RSPs (i.e. SINBAR<sub>3s,RSP</sub>), specificity was high (95%) for v-PSGs with AHI<sub>REM</sub><15/h, but low (26.7%) for v-PSGs with AHI<sub>REM</sub>>15/h. The index calculated in whole REM sleep (i.e. SINBAR<sub>30s,REM</sub>) had low specificity (40% for v-PSGs with AHI<sub>REM</sub><15/h and 0% for v-PSGs with AHI<sub>REM</sub>>15/h). These results indicate that the non-artifact corrected 3-s SINBAR EMG activity index in RSPs is a reliable RWA quantification method when AHI<sub>REM</sub><15/h.

Concerning the indices obtained from the mentalis/ submentalis EMG channels only, the artifact-corrected phasic, "any" and tonic EMG activity indices in REM sleep periods were always 100% specific for identification of iRBD patients. For v-PSGs with  $AHI_{REM} < 15/h$ , the indices obtained from the mentalis/ submentalis muscle only had specificity generally higher than 90%, thus indicating that all methods are very specific in case

		All v-PSGs			V-PSGs with AHI <sub>REM</sub> <	15/h		V-PSGs with AHI <sub>REM</sub>	15/h	
Category	RWA index	Cont.	iRBD	p-val	Cont.	iRBD	p-val	Cont.	iRBD	p-val
According to SINBAR group in REM	phasic-M <sub>3s, RSPAC</sub> (%)	3.7 [1.5–8.7]	23.6 [14.2–32.5]	<.001	4.2 [1.5–7.6]	23.3 [14.6–32.4]	<.001	2.5 [1.5–11.5]	24.9 [12.5–35.4]	.005
sleep periods with artifact	any-M <sub>3s,RSP,AC</sub> (%)	5.2 [1.7–9.0]	27.9 [14.7-46.2]	<.001	4.2 [1.5–7.6]	25.3 [15.4-42.4]	<.001	7.9 [2.0–13.4]	40.7 [12.5-51.0]	.012
correction	tonic-M <sub>30s,RSP,AC</sub> (%)	0.0 [0.0-0.0]	2.5 [0.0–8.8]	<.001	0.0 [0.0–0.0]	2.4 [0.1–7.8]	<.001	0.0 [0.0–1.7]	3.8 [0.0–20.3]	.028
	phasic-FDS <sub>3s,RSP,AC</sub> (%)	7.5 [5.2–16.2]	49.2 [44.5–58.9]	<.001	7.5 [5.2–11.2]	49.1 [45.2–58.3]	<.001	16.0 [5.5–21.3]	49.3 [43.3–60.6]	<.001
	SINBAR <sub>3s,RSP,AC</sub> (%) [reference]	15.7 [9.0–22.2]	63.9 [52.9–74.5]	<.001	11.9 [8.9–16.1]	63.6 [52.9–73.0]	<.001	22.0 [16.6–28.3]	68.4 [52.3–79.8]	<.001
According to SINBAR group in REM	phasic-M <sub>3s,RSP</sub> (%)	13.6 [7.3–26.3]	30.0 [20.8–38.6]	<.001	7.5 [6.3–9.8]	29.9 [20.3–38.3]	<.001	28.2 [17.1–38.6]	32.1 [23.1–40.8]	.474
sleep periods without artifact	any-M <sub>3s,RSP</sub> (%)	13.7 [7.3–26.4]	36.7 [21.1–50.0]	<.001	7.7 [6.4–10.2]	33.3 [20.4–45.7]	<.001	29.0 [17.7–39.1]	47.0 [25.9–52.7]	.095
correction	tonic-M <sub>30s,RSP</sub> (%)	0.0 [0.0–1.0]	3.4 [0.3–17.3]	<.001	0.0 [0.0–0.0]	2.6 [0.5–13.9]	<.001	0.0 [0.0–2.4]	4.5 [0.0–37.7]	079.
	phasic-FDS <sub>3sRSP</sub> (%)	7.5 [5.2–16.8]	50.2 [44.5–60.5]	<.001	7.5 [5.2–11.2]	50.8 [45.2–60.2]	<.001	16.0 [5.5–21.4]	49.3 [43.3–61.2]	<.001
	SINBAR <sub>3s,RSP</sub> (%)	22.0 [13.1–36.0]	67.5 [56.4–76.7]	<.001	14.3 [11.7–19.1]	67.4 [56.3–73.9]	<.001	36.9 [31.0–46.9]	67.6 [56.3–81.9]	<.001
According to SINBAR group in whole	phasic-M <sub>30s,REM</sub> (%)	8.9 [4.6–25.3]	28.7 [15.1–39.7]	<.001	5.3 [2.3–7.6]	27.4 [14.8–39.9]	<.001	26.3 [15.1–39.4]	33.3 [15.8–41.0]	.633
REM sleep without artifact cor-	any-M <sub>30,REM</sub> (%)	9.9 [5.2–32.3]	35.8 [18.8–56.0]	<.001	5.9 [2.7–9.0]	33.3 [18.2–50.3]	<.001	35.0 [20.2–42.1]	50.7 [23.9–63.9]	.283
rection	tonic-M <sub>30s,REM</sub> (%)	0.8 [0.0–2.9]	7.5 [1.8–22.2]	<.001	0.0 [0.0–1.3]	5.3 [1.2–19.6]	<.001	2.7 [0.8–9.9]	12.5 [1.8–42.4]	.107
	phasic-FDS <sub>30s,REM</sub> (%)	2.7 [1.4–7.6]	51.8 [44.4–68.2]	<.001	2.3 [0.8–5.6]	54.7 [44.0-67.7]	<.001	6.4 [1.5–10.0]	50.5 [45.0–75.6]	<.001
	SINBAR <sub>306,REM</sub> (%)	16.6 [8.7–37.8]	77.2 [63.5–86.5]	<.001	9.8 [5.1–15.3]	75.9 [63.1–83.4]	<.001	44.7 [31.3-50.0]	82.4 [70.5–92.7]	.002
RAI in REM sleep periods	RAI-M <sub>RSP</sub> (-)	0.98 [0.90–0.99]	0.82 [0.26–0.95]	<.001	0.99 [0.99–1.00]	0.83 [0.57–0.95]	<.001	0.89 [0.56–0.94]	0.34 [0.0-0.95]	.178
	RAI-SM <sub>ISP</sub> (-)	0.97 [0.90–0.99]	0.76 [0.28–0.92]	<.001	0.99 [0.97–1.00]	0.85 [0.37–0.92]	<.001	0.86 [0.66–0.96]	0.55 [0.06–0.84]	.031
	RAI-FDS <sub>RSP</sub> (–)	1.00 [0.99–1.00]	0.88 [0.82-0.94]	<.001	1.00 [0.99–1.00]	0.88 [0.83–0.94]	<.001	0.99 [0.98–1.00]	0.89 [0.80–0.93]	<.001
RAI in whole REM sleep	RAI- $M_{\rm REM}$ (–)	0.97 [0.90-0.99]	0.73 [0.21–0.93]	<.001	0.98 [0.98–0.99]	0.84 [0.51–0.92]	<.001	0.9 [0.47–0.93]	0.25 [0.0-0.93]	.209
	RAI-SM <sub>REM</sub> (–)	0.95 [0.87–0.98]	0.74 [0.26–0.89]	<.001	0.98 [0.96–0.99]	0.79 [0.35–0.89]	<.001	0.87 [0.62-0.92]	0.46 [0.04–0.84]	.064
	RAI-FDS <sub>REM</sub> (–)	0.99 [0.99–0.99]	0.89 [0.83-0.94]	<.001	0.99 [0.99–1.00]	0.89 [0.83–0.94]	<.001	0.99 [0.98–0.99]	0.89 [0.80–0.93]	<.001
SMI in REM sleep periods	SMI-M <sub>RSP</sub> (/h)	64.5 [30.2–105.1]	161.7 [119.4–194.3]	<.001	33.5 [23.9–64.6]	136.6 [118.9–182.3]	<.001	92.0 [67.4–122.0]	204.6 [142.3–230.4]	.020
	SMI-SM <sub>RSP</sub> (/h)	62.8 [37.5–109.7]	162.7 [131.0–206.9]	<.001	40.7 [24.6–79.8]	147.3 [122.2–188.2]	<.001	97.8 [64.1–119.0]	208.0 [171.4–231.5]	.004
	SMI-FDS <sub>RSP</sub> (/h)	108.7 [70.2–151.4]	214.1 [187.7–242.0]	<.001	85.2 [64.9–134.6]	217.0 [187.8–240.9]	<.001	133.8 [84.5–223.4]	198.1 [187.7–248.8]	.023
SMI in 30-s whole REM sleep	SMI-M <sub>REM</sub> (/h)	57.0 [34.9–101.0]	156.9 [119.7–196.4]	<.001	39.0 [27.4–64.9]	140.1 [118.4–179.8]	<.001	97.0 [63.8–136.9]	193.4 [145.6–230.7]	.015
	SMI-SM <sub>REM</sub> (/h)	66.3 [42.3–115.6]	161.9 [132.3–211.0]	<.001	46.5 [23.6–85.4]	149.3 [126.6–194.1]	<.001	103.4 [70.2–123.2]	208.9 [171.8-214.5]	.008
	SMI-FDS <sub>REM</sub> (/h)	110.1 [69.9–139.9]	209.7 [182.4–242.6]	<.001	89.2 [66.9–128.2]	215.5 [188.2–239.7]	<.001	139.0 [87.0–189.0]	191.3 [172.3–246.7]	.012
LMI in REM sleep periods	LMI- $M_{RSP}$ (/h)	23.8 [13.2–46.0]	113.9 [73.9–145.0]	<.001	13.7 [7.3–19.9]	107.7 [72.8–144.2]	<.001	46.3 [38.3–81.3]	125.2 [68.3–163.3]	.107
	LMI-SM <sub>RSP</sub> (/h)	37.9 [18.8–75.5]	126.6 [89.4–164.3]	<.001	23.2 [7.6–32.3]	125.3 [87.9–155.9]	<.001	73.2 [47.6–135.1]	138.3 [87.2–170.1]	.152
	LMI-FDS <sub>RSP</sub> (/h)	24.9 [15.6–54.9]	209.1 [178.8–243.2]	<.001	23.6 [15.1–37.0]	209.5 [183.6–240.2]	<.001	46.3 [15.6–76.0]	208.7 [146.2–247.4]	<.001
LMI in whole REM sleep	LMI- $M_{REM}$ (/h)	30.6 [16.1–62.3]	122.4 [75.7–155.5]	<.001	18.6 [8.2–29.8]	114.3 [74.2–151.1]	<.001	63.1 [40.1–80.5]	124.9 [74.7–168.1]	.056
	LMI-SM <sub>REM</sub> (/h)	47.6 [22.7–74.1]	120.4 [94.4–178.7]	<.001	29.5 [10.0–46.5]	120.0 [97.7–175.6]	<.001	75.8 [65.0–133.7]	136.9 [87.3–182.3]	.056
	$LMI-FDS_{REM}$ (/h)	34.0 [19.8–59.8]	206.9 [163.7–229.1]	<.001	29.9 [20.0–41.4]	205.0 [170.7–227.0]	<.001	51.7 [19.8–78.3]	213.1 [147.7–256.1]	<.001
SMI&LMI in REM sleep periods	SMI&LMI-M <sub>RSP</sub> (/h)	90.3 [43.8–139.0]	277.1 [194.6–365.4]	<.001	47.2 [37.3-89.4]	242.7 [194.5–329.7]	<.001	139.1 [110.8–250.4]	358.0 [244.4–378.8]	.014
	SMI&LMI-SM <sub>ESP</sub> (/h)	106.2 [57.1–192.2]	297.9 [227.5–377.1]	<.001	70.6 [29.9–112.1]	260.5 [216.9–375.6]	<.001	182.9 [115.7–270.3]	348.0 [302.1–398.3]	.008
	SMI&LMI-FDS <sub>RSP</sub> (/h)	130.3 [89.5–211.8]	435.3 [381.3–475.4]	<.001	112.5 [88.0–158.9]	435.0 [384.1–477.6]	<.001	197.2 [94.63–312.0]	448.3 [333.8-467.7]	<.001
SMI&LMI in whole REM sleep	SMI&LMIXM <sub>REM</sub> (/h)	96.0 [56.1–153.9]	272.4 [194.4–357.8]	<.001	58.7 [40.2–96.2]	254.4 [191.9–340.2]	<.001	155.9 [110.1–247.2]	345.0 [249.9–386.3]	.010
	SMI&LMI-SM <sub>REM</sub> (/h)	131.3 [66.4–190.0]	292.5 [240.5–387.7]	<.001	76.6 [30.2–132.3]	268.7 [236.7–363.5]	<.001	180.4 [135.7–250.0]	356.5 [287.5-419.6]	.007
	SMI&LMI-FDS <sub>REM</sub> (/h)	139.2 [98.5–197.7]	422.1 [367.2–461.6]	<.001	122.1 [96.3–158.2]	420.8 [393.6-456.8]	<.001	200.6 [104.3–259.7]	439.5 [319.9-463.1]	<.001

The values are shown as median and [25<sup>th</sup> percentile-75<sup>th</sup> percentile]. Statistical analyses were performed with Mann-U-Whitney tests. Significant *p*-values

are highlighted in bold. AC: artifact corrected; AHI<sub>BM</sub>: apnea-hypopnea index in REM sleep; Cont: controls; iRBD: isolated REM sleep behavior disorder; FDS: flexor digitorum superficialis; LMI: long muscle activity index; M: mentalis; RAI: REM atonia index; REM: rapid eye movement sleep; SM: submentalis; SMI: short muscle activity index; SINBAR: Sleep Innsbruck Barcelona; v-PSG: video-polysomnography.

Table 2. Values of the computed RWA indices

of AHI in REM sleep lower than 15/h. The highest sensitivity was observed for LMI-M<sub>REM</sub> (96.3%), followed by LMI-M<sub>RSP</sub> (88.9%) and phasic-M<sub>305,REM</sub> (85.0%). For v-PSGs with AHI<sub>REM</sub> $\geq$ 15/h, the RWA indices obtained from the mentalis/submentalis muscle only generally showed moderate to high sensitivity values, but low to moderate specificity values.

Additional analyses. In the Supplemental Material (Section S2 and Supplementary Figures S7–S9), additional analyses report: i) differences in sensitivity and specificity between v-PSGs with  $\text{AHI}_{\text{\tiny REM}}{<}15/h$  and with  $\text{AHI}_{\text{\tiny REM}}{\geq}15/h;$  ii) difference in sensitivity and specificity between the indices computed in RSPs and in whole REM sleep; and iii) differences in difference in sensitivity and specificity of the SINBAR indices with and without artifact correction. Briefly, such analyses show that: i) increased frequency of apneas and hypopneas in REM sleep make most of the RWA indices less specific for identification of iRBD patients; ii) the RWA indices obtained from the FDS muscles alone were the ones showing the most similar values of sensitivity and specificity when computed in RSPs or in whole REM sleep; and iii) for the indices proposed by the SINBAR group, artifact correction is fundamental to avoid RWA over-quantification in case of AHI in REM sleep over 15/h, and artifact correction did not change the performances of the phasic FDS EMG activity index when AHI in REM sleep is lower than 15/h, thus demonstrating the robustness of FDS muscular activity to artifacts.

#### Discussion

Based on the fact that semi-automatic quantification of RWA according to the SINBAR recommendations is a precise, but timeconsuming process, the aim of this study was to investigate other (semi)-automated methods with less human intervention to identify a fast but still reliable RWA quantification method. Since FDS muscular activity is minimally affected by artifacts, we hypothesized that automatically identified muscular activity in the FDS muscles alone can be used as a fast screening tool in clinical practice to either rule out or confirm RWA. The main results of our analyses are the following: i) RWA indices calculated from the FDS muscles alone have higher AUC values compared to the RWA indices including the mentalis/submentalis muscle; ii) when using previously proposed cut-offs, the RWA indices obtained from the FDS muscles alone had 100% sensitivity and specificity not inferior to the specificity of RWA indices obtained from the mentalis/submentalis muscle alone; iii) when performing only manual selection of RSPs (but not artifact correction), the 3-s SINBAR EMG activity index had 100.0% sensitivity and 95.0% specificity to identify iRBD patients in case of AHI<sub>REM</sub><15/h; iv) when performing only traditional scoring of REM sleep (i.e. without additional manual selection of RSPs nor artifact correction), the 30-s phasic FDS EMG activity index (phasic-FDS<sub>305 REM</sub>) and the long muscle activity index (LMI-FDS<sub>REM</sub>) allowed to identify iRBD patients with 100.0% sensitivity and 85.0% specificity in case of AHI in REM sleep lower than 15/h.

Based on these findings, we suggest the following step-wise approach to quickly rule out RWA in clinical practice in subjects with  $AHI_{REM}$  <15/h:

 Check whether saturation, electrical or other technical and ECG artifacts affect the FDS channels in scored REM sleep;

- ii) If at least one FDS channel has none of these artifacts in REM sleep, compute the phasic-FDS<sub>305,REM</sub> or the LMI-FDS<sub>REM</sub> RWA indices;
- iii) If the indices are below the respective previously published cut-offs (i.e. 7.7% for phasic-FDS<sub>305,REM</sub> and 50.1/h for LMI-FDS<sub>REM</sub>), RWA can be ruled out. Otherwise, quantify RWA in REM sleep periods according to the SINBAR recommendations (including manual artifact correction) by combining "any" mentalis and phasic FDS muscular activity to definitely assess RWA [6].

Such approach has two main advantages: i) due to the 100% sensitivity, no patient with RWA is missed; and ii) there is only a relatively little number of false positives subjects, for which RWA can be ruled out by quantifying RWA according to the SINBAR recommendations.

This study is the first to analyze the diagnostic accuracy of FDS muscles when used alone compared to the reference SINBAR method. One previous study compared the diagnostic accuracy of different RWA quantification methods in Parkinson's disease patients when the SINBAR method applied to 30-s epochs in whole REM sleep was used as reference [31], but diagnostic accuracy of the FDS muscles alone was not analyzed in this study. Another previous study compared different automated RWA quantification methods [16], but also in that case no analysis was performed for FDS muscular activity alone, due to absence of FDS recording.

When considering all v-PSGs, the AUC analyses indicate that, independently from the automatic/semi-automatic method used, muscular activity in the FDS muscles alone was generally significantly more discriminative than muscular activity in the mentalis/submentalis muscle alone. When the v-PSGs were separated into the ones with  $AHI_{REM}$  <15/h and  $AHI_{REM}$  ≥15/h, the RWA indices from the FDS muscles alone had generally higher AUC values compared to the RWA indices obtained from the mentalis/submentalis muscle alone, but significance was only very seldom observed, probably because of the limited amount of v-PSGs included in the analyses. Furthermore, the RWA indices obtained from the FDS muscle alone had generally higher AUC values (even if not significantly higher) than the nonartifact corrected SINBAR EMG activity indices. This indicates that, when not performing manual artifact correction, the FDS muscles alone has higher discrimination power than the combination of mentalis and FDS muscles, probably because of the higher number of artifacts in the mentalis muscle compared to the FDS [26].

Previous validations of the RAI calculated in the submentalis muscle showed that sensitivity to identify iRBD patients ranged between 74.3% and 96% and specificity ranged between 51% and 92.3% when using the cut-off of 0.9 [10,30,35]. When using instead the cut-off of 0.8, the sensitivity ranged between 38.5% and 84%, and the specificity between 81% and 100% [10,30]. When considering RAI calculated in whole REM sleep, our results are within these ranges, thus confirming previous reports of the discrimination ability of RAI. A cut-off for RAI has never been proposed when applied to the FDS muscles, therefore we could not calculate its sensitivity and specificity. However, the AUC values obtained for RAI in the FDS are higher than the ones obtained for the mentalis/submentalis muscle, thus indicating that RAI calculated in the FDS muscles has higher discrimination power than in the mentalis/submentalis muscles to identify iRBD patients.

Table 3.	Values of area	under the receiver	operating ch	aracteristic curves	to distinguish iRBD	patients from	controls
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			V-PSGs with	V-PSGs with
Category	RWA index	All v-PSGs	AHI <sub>REM</sub> <15/h	$AHI_{REM} \ge 15/h$
According to SINBAR group in REM sleep	nhasic-M	0.835	0.831	0.852
noticely with artifact correction	priusic-im <sub>3s,RSP,AC</sub>	0.000	0.651	0.052
perious with unifact correction	anu-M	0.885	0.916	0.815
	uny Ivi <sub>3s,RSP,AC</sub>	0.885	[0.780_0.985]	[0.434_0.970]
	tonic-M	0.789	0.833	0 748
	COMC <sup>-101</sup> 30s,RSP,AC	0.785	[0 721_0 923]	[0 514_0 933]
	nhasic-FDS	0.0039=0.808]	1 000	0.003
	private 1 DO <sub>3s,RSP,AC</sub>	[0.980_1.000]	[1,000-1,000]	[0.888_1.000]
	SINBAR [reference]	1 000	1 000	1 000
	SHADA MA <sub>3s,RSP,AC</sub> [rejerence]	[1 000-1 000]	[1,000-1,000]	[1 000_1 000]
According to SINBAR group in REM sleep	nhasic-M	0.782	0.948	0 593
neriods without artifact correction	privisic Wi <sub>3s,RSP</sub>	0.702 [0.654_0.883]	[0.836_0.989]	[0 342_0 824]
perious without unified correction	any-M	0.814	0.952	0 711
	arry <sup>IVI</sup> 3s,RSP	[0 687-0 890]	[0.849_0.988]	[0 391_0 911]
	tonic-M	0 779	0 844	0 711
	corrice IVI <sub>30s,RSP</sub>	0.779	[0 710_0 927]	[0.426_0.926]
	nhasic-FDS	0 997	1 000	0.993
	private 1 D D <sub>3s,RSP</sub>	[0 984–1 000]	[1 000-1 000]	[0.899_1.000]
	SINBAR	0.978	1 000	0.941
	SHVD/ HC3s,RSP	[0 928-0 996]	[1 000-1 000]	[0.680–1.000]
According to SINBAR group in whole	nhasic-M	0 753	0.927	0 563
REM sleen without artifact correction	privisic Wi <sub>30s,REM</sub>	0.755 [0.610_0.855]	[0.798_0.977]	[0 297_0 812]
REW Sleep without and just correction	anv-M	0 761	0.926	0.637
	30s,REM	[0 635-0 856]	[0.829_0.982]	[0 322-0 883]
	tonic-M	0 764	0.861	0 704
	COMIC IVI30s,REM	[0 639-0 862]	[0 731-0 940]	[0 411_0 899]
	nhasic-FDS	0.995	1 000	0.993
	private 1 DO <sub>30s,REM</sub>	[0.966_1.000]	[1,000-1,000]	[0.906_1.000]
	SINBAR	0.963	1 000	0.896
	30s,REM	[0 863-0 993]	[1 000-1 000]	[0 654-1 000]
RAL in RFM sleen periods	RAI-M	0 799	0.963	0.670
	TO IN RSP	[0.669–0.887]	[0.862-1.00]	[0.367-0.895]
	RAI-SM	0.821	0.946	0.770
	III II OTTRSP	[0 704-0 899]	[0.847-0.985]	[0 510-0 919]
	RAI-FDS	0.992	0.999	0.989
	RSP	[0.963-1.000]	[0.977-1.000]	[0.890-1.000]
RAI in whole REM sleep	RAI-M	0.795	0.943	0.659
r	REM	[0.669–0.884]	[0.818-0.989]	[0.342-0.888]
	RAI-SM	0.809	0.927	0.733
		[0.690-0.867]	[0.811-0.976]	[0.431-0.924]
	RAI-FDS	0.988	0.997	0.985
	REM	[0.946-1.000]	[0.969-1.000]	[0.824-1.000]
SMI in REM sleep periods	SMI-Maga	0.850	0.922	0.793
	- RSP	[0.721-0.930]	[0.751-0.985]	[0.544-0.952]
	SMI-SM <sub>pcp</sub>	0.844	0.867	0.859
	KSP	[0.712-0.923]	[0.688–0.959]	[0.549–0.963]
	SMI-FDS <sub>non</sub>	0.894	0.981	0.785
	KSP	[0.777-0.959]	[0.904-0.998]	[0.529-0.943]
SMI in whole REM sleep	SMI-M	0.863	0.937	0.807
1	KLM	[0.746-0.929]	[0.790-0.990]	[0.531-0.948]
	SMI-SM <sub>pm</sub>	0.846	0.879	0.830
	KLM	[0.711-0.928]	[0.684–0.962]	[0.527–0.958]
	SMI-FDS	0.917	0.987	0.815
	KLM	[0.804–0.970]	[0.926-1.000]	[0.571-0.951]
LMI in REM sleep periods	LMI-M <sub>non</sub>	0.868	0.967	0.704
* *	къr	[0.753–0.935]	[0.880-1.000]	[0.357–0.905]
	LMI-SM <sub>non</sub>	0.846	0.965	0.681
	K5P	[0.711-0.919]	[0.878–0.995]	[0.422-0.870]
	LMI-FDS <sub>non</sub>	0.996	1.000	0.993
	- KSP	[0.976-1.000]	[1.000-1.000]	[0.914–1.000]

#### Table 3. Continued

Category	RWA index	All v-PSGs	V-PSGs with AHI <sub>REM</sub> <15/h	V-PSGs with AHI <sub>REM</sub> ≥15/h
LMI in whole REM sleep	LMI-M <sub>REM</sub>	0.868	0.963	0.741
		[0.764–0.937]	[0.880-1.000]	[0.375–0.911]
	LMI-SM <sub>PEM</sub>	0.869	0.969	0.741
	i\Livi	[0.757–0.936]	[0.866–0.995]	[0.440-0.926]
	LMI-FDS <sub>PEM</sub>	0.995	1.000	0.985
	IXLIVI	[0.968–1.000]	[1.000-1.000]	[0.866-1.000]
SMI&LMI in REM sleep periods	SMI&LMI-M	0.869	0.954	0.807
	KJF	[0.759–0.937]	[0.814-0.996]	[0.512–0.954]
	SMI&LMI-SM	0.853	0.917	0.829
	KSF	[0.728-0.931]	[0.765–0.977]	[0.556–0.963]
	SMI&LMI-FDS	0.982	1.000	0.948
	KSF	[0.941-0.994]	[1.000-1.000]	[0.772-1.000]
SMI&LMI in whole REM sleep	SMI&LMI-M	0.882	0.961	0.822
*	KEM	[0.776-0.947]	[0.835-1.000]	[0.528–0.956]
	SMI&LMI-SM	0.863	0.928	0.837
	KLM	[0.744-0.935]	[0.805-0.978]	[0.534-0.963]
	SMI&LMI-FDS	0.987	1.000	0.948
	KLM	[0.948–0.998]	[1.000-1.000]	[0.765–1.000]

The values are shown as point estimates together with the 95% confidence intervals, which were obtained with 1,000 bootstrap replicas.

AC: artifact corrected; AHI<sub>REM</sub>: apnea-hypopnea index in REM sleep; FDS: flexor digitorum superficialis; LMI: long muscle activity index; M: mentalis; RAI: REM atonia index; REM: rapid eye movement sleep; RSP: REM sleep period; SM: submentalis; SMI: short muscle activity index; SINBAR: Sleep Innsbruck Barcelona; v-PSG: video-polysomnography.

The only study where SMI, LMI, and SMI&LMI were validated showed that for the mentalis muscle the sensitivity and specificity were 85% and 83.3% for SMI, and 75% and 80% for LMI, respectively [12]. When considering the FDS muscles, sensitivity and specificity were 75% and 90% for SMI and 80% and 80% for LMI, respectively [12]. In our cohort, these indices calculated in whole REM sleep had generally lower specificity than in that study. This could be explained by different type of patients included as controls.

In 2012 the SINBAR group proposed the cut-offs for phasic mentalis, "any" mentalis, tonic mentalis, and phasic FDS EMG activity to identify RBD patients with 100% specificity [6]. Our results show that 100% specificity was achieved for the artifact corrected indices obtained for the mentalis muscle only, thus confirming that the previously proposed cut-offs are highly specific to identify patients with RWA. For the phasic FDS EMG activity, 100% sensitivity (but not 100% specificity) was achieved when using the previously validated cut-off. This might seem in contradiction with a previous report, where some iRBD patients had phasic FDS activity below the respective cut-off [20]. However, the cut-offs proposed by the SINBAR group were based on manual scoring of muscular activity and the BrainRT algorithm might be more sensitive than the human eye to recognize short bursts of muscular activity in the FDS muscles. This could explain why the automatic phasic FDS EMG activity index had 100% sensitivity. Our results show that the tonic mentalis EMG activity index was very specific, but not sensitive to identify patients with iRBD. In particular, sensitivity was lower compared to the study where the algorithm was validated [21]. This might be due to the fact that only few iRBD patients had tonic activity and that the cut-off proposed by the SINBAR group was based on a mixed population, including iRBD patients and Parkinson's disease patients with RBD, who had significantly higher tonic activity than iRBD patients [6]. It has been shown that tonic activity increases over time both in iRBD

patients [36] and in patients with overt alpha-synucleinopathies [25]. Therefore, the originally proposed cut-off for tonic activity by the SINBAR group might have been influenced by the inclusion of subjects with advanced iRBD and/or Parkinson's disease.

Our analyses allow also to compare the discrimination capabilities of the RWA indices when computed in manually selected RSPs or in whole REM sleep. Compared to scoring RWA in whole REM sleep, RWA scoring in RSPs allows to systematically exclude arousals and to have a more meticulous identification of the areas to be used for RWA quantification. For RAI, SMI, LMI, and SMI&LMI indices, when calculated in whole REM sleep, the AUCs of the RWA indices were not significantly different than when computed in RSPs. When using previously proposed thresholds, the sensitivity and specificity were also similar. These results are in line with a previous comparative study [16]. For the RWA indices proposed by the SINBAR group, both selection of RSPs, as well as manual artifact correction, need to be taken into account when comparing the performances. No significant differences were seen in the AUC values, thus indicating that the indices have similar discrimination capabilities. However, when using previously proposed cut-offs, for the RWA indices calculated considering the mentalis muscle, the manual selection of REM sleep epochs and manual artifact correction increased the specificity for identification of iRBD patients. Instead, the phasic FDS EMG activity index had generally similar performances when calculated in RSPs, in whole REM sleep, and when performing or not manual artifact correction. This further proves that muscular activity in the FDS muscle is a reliable measure of RWA [26], less influenced by artifacts. Finally, it should be further remarked that, in RSPs and for v-PSGs with AHI<sub>REM</sub><15/h, the non-artifact corrected 3-s SINBAR EMG activity index had 100% sensitivity and 95% specificity. This indicates that, if automatic methods will be developed to select RSPs, the automatic SINBAR index without artifact correction should be used for fast and precise screening of RWA in patients with AHI<sub>REM</sub> <15/h.

Table 4. Sensitivity and specificity for d	discriminating iRBD	patients from con	trols when using prev	riously published three	sholds			
			All v-PSGs		V-PSGs with AHI	$I_{REM} < 15/h$	V-PSGs with $AHI_{RET}$	$_{h} \ge 15/h$
Category	RWA index	Cut-off	Sens (%)	Spec (%)	Sens (%)	Spec (%)	Sens (%)	Spec (%)
According to SINBAR group in REM sleep	phasic-	16.3%	69.4	100.0	70.4	100.0	66.7	100.0
periods with artifact correction	$\mathrm{M}_{\mathrm{3s,RSP,AC}}$		[53.2-82.9]	[100.0–100.0]	[50.0-86.2]	[100.0 - 100.0]	[25.0–91.7]	[100.0 - 100.0]
	any-M <sub>3s,RSP,AC</sub>	18.2%	69.4	100.0	70.4	100.0	66.7	100.0
			[52.0-82.1]	[100.0 - 100.0]	[50.0–85.2]	[100.0 - 100.0]	[28.6–91.5]	[100.0 - 100.0]
	tonic-	9.6%	22.2	100.0	22.2	100.0	22.2	100.0
	${ m M}_{ m 308,RSP,AC}$		[10.0–37.3]	[100.0 - 1.00.0]	[8.7–39.4]	[100.0 - 100.0]	[0.0-62.5]	[100.0 - 100.0]
	phasic-	16.8%	100.0	80.0	100.0	90.0	100.0	66.7
	FDS <sub>3s,RSP,AC</sub>		[100.0–100.0]	[62.8–90.3]	[100.0 - 100.0]	[65.5–100.0]	[100.0 - 100.0]	[39.4–88.3]
	SINBAR <sub>3s,RSP,AC</sub>	31.9%	100.0	100.0	100.0	100.0	100.0	100.0
	[reference]		[100.0–100.0]	[100.0 - 100.0]	[100.0–100.0]	[100.0 - 100.0]	[100.0 - 100.0]	[100.0 - 100.0]
According to SINBAR group in REM sleep	phasic-M <sub>3s,RSP</sub>	16.3%	83.3	62.9	81.5	95.0	88.9	20.0
periods without artifact correction			[64.9–93.8]	[45.5–76.9]	[63.0–92.9]	[75.8–100.0]	[41.7 - 100.0]	[5.9–49.0]
	any-M <sub>3s.RSP</sub>	18.2%	83.3	65.7	81.5	95.0	88.9	20.0
	×		[67.9–93.3]	[46.0–79.4]	[61.6–92.9]	[68.8–100.0]	[31.7–100.0]	[5.9–47.7]
	tonic-M <sub>30s.RSP</sub>	9.6%	33.3	94.3	29.6	100.0	44.4	86.7
	×		[19.4–50.0]	[82.8–100.0]	[13.6-48.1]	[100.0 - 100.0]	[10.0-80.00]	[60.4 - 100.0]
	phasic-	16.8%	100.0	74.3	100.0	90.0	100.0	53.3
	FDS <sub>3s.RSP</sub>		[100.0 - 100.0]	[58.5-87.2]	[100.0–100.0]	[66.8–100.0]	[100.0 - 100.0]	[25.0-77.8]
	SINBAR <sub>3s.RSP</sub>	31.9%	100.0	65.7	100.0	95.0	100.0	26.7
			[100.0–100.0]	[50.0-81.1]	[100.0–100.0]	[68.1 - 100.0]	[100.0 - 100.0]	[7.7–50.0]
According to SINBAR group in whole REM	phasic-	10.6%	86.1	57.2	85.2	95.0	88.9	6.7
sleep without artifact correction	$\mathbf{M}_{30s, \text{REM}}$		[71.0–94.6]	[40.0–73.8]	[64.3–95.8]	[69.5–100.0]	[40.0 - 100.0]	[0.0–37.3]
	any-M <sub>30s,REM</sub>	14.5%	80.6	60.0	77.8	95.0	88.9	13.3
			[64.7–91.4]	[43.4–76.3]	[60.0–91.3]	[70.0–100.0]	[36.7–100.0]	[0.0-40.0]
	tonic-M <sub>30s,REM</sub>	8.7%	41.7	85.7	37.0	100.0	55.6	66.7
			[26.9–59.2]	[70.9–94.9]	[20.8–58.1]	[100.0 - 100.0]	[18.5–88.9]	[37.5-86.7]
	phasic-	7.7%	100.0	74.3	100.0	85.0	100.0	60.0
	FDS <sub>30s,REM</sub>		[100.0–100.0]	[55.6–86.1]	[100.0–100.0]	[65.0–95.8]	[100.0 - 100.0]	[33.3–83.3]
	SINBAR <sub>30s,REM</sub>	27.2%	100.0	22.9	100.0	40.0	100.0	0.0
			[100.0 - 100.0]	[11.1 - 39.0]	[100.0–100.0]	[20.0-63.2]	[100.0 - 100.0]	[0:0-0:0]
RAI in REM sleep periods	RAI-SM <sub>RSP</sub>	0.8	52.8	85.7	48.1	100.0	66.7	66.7
			[35.5–68.4]	[71.5–94.6]	[29.2–66.7]	[100.0 - 100.0]	[33.3–91.0]	[40.0-86.7]
	$RAI-SM_{RSP}$	0.9	66.7	77.1	63.0	100.0	77.8	46.7
			[50.0–81.2]	[57.7-88.4]	[44.0–80.0]	[100.0 - 100.0]	[40.0–100.0]	[21.4–73.3]
RAI in whole REM sleep	$RAI-SM_{REM}$	0.8	55.6	88.6	51.9	100.0	66.7	73.3
			[41.2–73.2]	[72.0–96.8]	[32.1–70.0]	[100.0 - 100.0]	[25.0–92.2]	[47.1 - 92.4]
	$RAI-SM_{REM}$	0.9	77.8	71.4	77.8	95.0	77.8	40.0
			[61.6–89.6]	[54.4–86.5]	[59.5–90.9]	[71.6–100.0]	[29.8–100.0]	[18.5–68.6]
SMI in REM sleep periods	$SMI-M_{RSP}$	90.1/h	77.8	71.4	77.8	90.0	77.8	46.7
			[62.1–90.9]	[54.3-85.0]	[57.8–90.9]	[68.3–100.0]	[37.5–100.0]	[23.5–76.5]
	SMI-FDS <sub>RSP</sub>	124.3/h	100.0	60.0	100.0	70.0	100.0	46.7
			[100.0–100.0]	[42.5–75.6]	[100.0–100.0]	[47.4–86.7]	[100.0–100.0]	[20.0–72.9]

			All v-PSGs		V-PSGs with AHI	l <sub>REM</sub> <15/h	A-FOC WILL MILE	II /CT ≂ <sup>M</sup>
Category	RWA index	Cut-off	Sens (%)	Spec (%)	Sens (%)	Spec (%)	Sens (%)	Spec (%)
SMI in whole REM sleep	$SMI-M_{REM}$	90.1/h	86.1	62.9	85.2	80.0	88.9	40.0
1			[72.9–96.2]	[45.6–76.6]	[66.7–96.3]	[56.3-94.1]	[48.5 - 100.0]	[15.4–66.7]
	SMI-FDS <sub>RFM</sub>	124.3/h	100.0	57.2	100.0	70.0	100.0	40.0
			[100.0–100.0]	[39.5–72.3]	[100.0-100.0]	[45.5-88.9]	[100.0 - 100.0]	[17.6–69.2]
LMI in REM sleep periods	LMI-M <sub>RSP</sub>	43.1/h	86.1	65.7	88.9	95.0	77.8	26.7
			[70.7–94.9]	[47.1-80.6]	[72.9–100.0]	[67.0-100.0]	[40.0 - 100.0]	[7.1–58.9]
	LMI-FDS <sub>Rep</sub>	50.1/h	100.0	74.3	100.0	90.0	100.0	53.3
			[100.0 - 100.0]	[58.5-87.2]	[100.0-100.0]	[67.1 - 100.0]	[100.0 - 100.0]	[26.7–75.0]
LMI in whole REM sleep	LMI-M <sub>RFM</sub>	43.1/h	94.4	65.7	96.3	95.0	88.9	26.7
			[81.9–100.0]	[50.0-82.3]	[81.6–100.0]	[73.0-100.0]	[50.0–100.0]	[7.7–53.8]
	LMI-FDS <sub>REM</sub>	50.1/h	100.0	68.6	100.0	85.0	100.0	46.7
			[100.0–100.0]	[50.0-83.8]	[100.0-100.0]	[62.0–95.5]	[100.0–100.0]	[21.4–73.3]

atonia index, REM: rapid eye movement sleep; RSP: REM sleep period; SM: submentalis; SMI: short muscle activity index; SINBAR: Sleep Innsbruck Barcelona; v-PSG:

video-polysomnography.

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RWA indices were generally less specific for v-PSGs with  $AHI_{REM} \ge 15/h$  than with  $AHI_{REM} < 15/h$ . Considering also our previous findings that the number of artifacts in the mentalis muscle increases linearly with  $AHI_{REM}$  [26], our results further substantiate recent recommendations stating to perform RWA quantification only when  $AHI_{REM} < 15/h$  [23]. Therefore, positive airway pressure treatment should be sought in order to avoid over-quantification and less reliable RWA quantification, as well as to avoid possible mimics of RBD due to movements related to respiratory events [37].

Recording of FDS muscular activity is still not routinely performed in clinical practice, despite many studies have shown its diagnostic utility in the context of RBD [6,19,20]. Our results demonstrate another additional practical benefit of recording muscular activity in the FDS muscles, as automatic FDS analysis would allow not to miss any patient with RWA. It should be pointed out that a visual analysis of the FDS muscles is always recommended before calculating the automated indices. Despite rare, excessive fragmentary myoclonus as well as respiration artifacts might affect the FDS channels.

The proposed fast screening using automatic analysis of FDS muscular activity might be particularly useful in the context of identification of patients with isolated RWA (iRWA). This is relevant because increasing reports are showing that iRWA likely represents the prodromal stage of iRBD and therefore a very early stage of alpha-synucleinopathies [2,38–40].

However, our findings should not be interpreted in the strict sense that the RWA quantification should be performed only considering FDS muscular activity. The combination of mentalis and FDS muscular activity in REM sleep periods should still be considered as the gold standard for a definite identification of RWA. Furthermore, RWA quantification in the mentalis/submentalis muscle is relevant, as muscular activity in the mentalis/submentalis has been proven to increase over time [36] and to be a marker of conversion to overt alpha-synucleinopathies [41–43], while no study has evaluated whether muscular activity in the FDS muscles can also be considered useful as biomarker of progression and/or conversion to an overt alpha-synucleinopathies.

Our study has a number of limitations. First, we included a similar amount of v-PSG of iRBD patients and controls, however, iRBD patients and controls are not equally represented in the typical population of a sleep lab, due to the relatively low prevalence of RBD [44]. Second, we included only patients with iRBD and none with RBD associated to overt alpha-synucleinopathies, narcolepsy, or other diseases. The utility of muscular activity quantification in the FDS alone as a screening method for RWA quantification should be evaluated in the future in a study population representative of a typical sleep lab cohort, as well as including patients with RBD associated with other pathologies. In particular, the findings here reported should be validated in patients with RBD associated with overt alpha-synucleinopathies. Third, we implemented the automatic RAI, SMI, LMI, and SMI&LMI by following the descriptions of the algorithms described in the original publications [9-11], but we did not have access to the original code of the methods. Thus, there might be small implementation differences between the methods here used and the original described methods. Fourth, significant difference on gender distribution as well as on antidepressant intake between iRBD patients and controls was found. While we decided to have age-matched groups and only patients over 50 years due the importance of a



Figure 3. P-values obtained for pairwise comparison of area under the receiver operating characteristic curve values. All-v-PSGs were included. The color code used is shown in the legend. Dark red = p < .001; red = p < .01; orange = p < .05; light yellow =  $p \ge .05$ ; white = p not calculated. Legend: AC: artifact corrected; AHI<sub>REM</sub> apnea-hypopnea index in REM sleep; FDS: flexor digitorum superficialis; LMI: long muscle activity index; M: mentalis; RAI: REM atonia index; REM: rapid eye movement sleep; RSP: REM sleep period; RWA: REM sleep without atonia; SM: submentalis; SMI: short muscle activity index; SINBAR: Sleep Innsbruck Barcelona; v-PSG:

correct diagnosis of iRBD in such population, we did not aim at having gender and antidepressant-matched groups. This is because higher male prevalence is usually seen in iRBD cohorts [45] and because the role of antidepressants in RBD patients in the context of progression to an overt alpha-synucleinopathy is still not clear [2].

video-polysomnography.

In conclusion, our study shows that automatic analysis of muscular activity in the FDS muscles (i.e. performed in whole REM sleep and without artifact correction) can be used as a first screening tool to rule out RWA for subjects with  $\mathrm{AHI}_{\scriptscriptstyle\mathrm{REM}}\!\!<\!\!15/h.$ Automatic RWA quantification is instead not recommended for subjects with  $AHI_{REM} \ge 15/h$ . However, the final RWA quantification as part of a certain RBD diagnosis should still be performed combining FDS and mentalis muscular activity in RSPs and

carefully correcting for possible artifacts. Our results underline the importance of including recording of FDS muscular activity in the clinical routine, as it can provide a fast and preliminary measure to rule out RWA and make diagnostic procedures faster.

#### Supplementary material

Supplementary material is available at SLEEP online.

# Funding

This study was supported by the Austrian Science Fund (FWF), project I2120-B27.

## Acknowledgement

We would like to thank Heinz Hackner for excellent manual scoring of v-PSGs.

### **Disclosure Statement**

Financial disclosure: none.

Non-financial disclosure: none. Conflict of interest: none.

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