## Subjective sleep quality in healthy subjects - What can PSG really tell us?

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## The polysomnographic SIESTA database

195 healthy subjects/97 patients were investigated for 2 consecutive nights, resulting in a total of 584 polysomnographies


8 clinical partners:
1 Holland Sleep Research
2 Philipps University Marburg
3 University of Mainz
4 Hospital de la Santa Creu i Sant Pau, Barcelona
5 Tampere University Hospital
6 Free University of Berlin
7 Department of Psychiatry, Medical University of Vienna 8 Department of Neurology, Medical University of Vienna

## Entrance Examination for the SIESTA and SENSATION WP 1.6 Database

Table 1. Entrance examination.

| Examination | Exclusion criteria (if applicable) |
| :---: | :---: |
| Physical examination | Any significant medical condition interfering with the aim of the study |
| Mini Mental State Examination | MMSE score ( 30 items) <25 |
| Self-rated scales | Pittsburgh Sleep Quality Index: global score $>5$; PSQI item 1: usual bedtime before 22.00 or after 24.00 hours |
|  | Quality of Life Questionnaire |
|  | Generalised Self-Efficacy Scale |
|  | Self-rated Anxiety Scale: raw score $\geq 33$ |
|  | Self-rated Depression Scale: raw score $\geq 35$ |
|  | Personal Inventory |
| Blood tests | Clearly pathological values for haemoglobin, haematocrit, erythrocyte count, leukocyte count, platelet count, ALT, AST, gamma-GT, bilirubin, alkaline phosphatase, creatinine, free T3; single laboratory values outside the normal range were generally not regarded as an exclusion criterion provided <br> - they were not accompanied by clinical symptoms; <br> - the context of related laboratory values did not indicate a pathological process; and <br> - the investigator regarded these laboratory values as clinically irrelevant and documented that in writing on the Case Report Form. |

## Normal Healthy Subjects (PSQI $\leq 5$ )

- 177 healthy subjects (83 males and 94 females) aged between 20 and 95 years.


## Normal Healthy Subjects (PSQI $\leq 5$ )


$\square$ male
$\square$ female

## Evaluation of "Subjective Sleep Quality"

Self-Rating Scale for Sleep and Awakening Quality (SSA)
by Saletu et al. (1987)

20 items => 3 subscores and 1 total score
SSA-1 subjective sleep quality
SSA-2 subjective awakening quality
SSA-3 somatic complaints
$\qquad$

## SELF-RATING SCALE FOR SLEEP AND AWAKENING QUALITY (SSA)

| SLEEP QUALITY | no | slightly | moderately | very much |
| :--- | :---: | :---: | :---: | :---: |
| 1. Did you sleep well ? |  |  |  |  |
| 2. Did you have deep sleep? |  |  |  |  |
| 3. Did you have difficulties in falling asleep? |  |  |  |  |
| 4. Did you have difficulties in staying asleep? |  |  |  |  |
| 5. Did you have bad dreams? |  |  |  |  |
| 6. Did you have difficulties getting back to sleep? |  |  |  |  |
| 7. Did you wake up earlier than usual? |  |  |  |  |

Subscore 1:

| AWAKENING QUALITY | no | slightly | moderately | very much |
| :--- | :---: | :---: | :---: | :---: |
| 8. Did you feel giddy after awakening? |  |  |  |  |
| 9. Did you feel disorientated? |  |  |  |  |
| 10. Did you feel tired? |  |  |  |  |
| 11. Were you in a good mood? |  |  |  |  |
| 12. Did you feel interested in your surroundings? |  |  |  |  |
| 13. Did you feel slowed down? |  |  |  |  |
| 14. Was your attention / concentration reduced? |  |  |  |  |
| 15. Did you feel refreshed and rested? |  |  |  |  |

Subscore 2: $\qquad$

| SOMATIC COMPLAINTS | no | slightly | moderately | very much |
| :---: | :---: | :---: | :---: | :---: |
| 16. Any nausea after awakening? |  |  |  |  |
| 17. Any headache? |  |  |  |  |
| 18. Dryness of your mouth? |  |  |  |  |
| 19. Any dizziness? |  |  |  |  |
| 20. Incoordination of movements? |  |  |  |  |
| Subscore 3: __ , Total score: |  |  |  |  |
| 22. When did you go to bed? |  |  |  | min. |
| 23. When did you turn out the lights? |  | h. $\qquad$ min. |  |  |
| 24. When did you fall asleep? |  | h. $\qquad$ min. |  |  |
| 25. How often did you awake during the night? |  | times |  |  |
| 26. When was your final awakening? |  | - | h. | $\ldots \mathrm{min}$. |
| 27. How much sleep did you get at all? |  |  | hrs. | $\underline{m i n}$. |
| 28. When did you get out of bed? |  | - | h. | $\ldots \mathrm{min}$. |

## Evaluation of "Subjective Sleep Quality"

| SLEEP QUALITY | no | slightly | moderately | very much |
| :--- | :---: | :---: | :---: | :---: |
| 1. Did you sleep well ? |  |  |  |  |
| 2. Did you have deep sleep? |  |  |  |  |
| 3. Did you have difficulties in falling asleep? |  |  |  |  |
| 4. Did you have difficulties in staying asleep? |  |  |  |  |
| 5. Did you have bad dreams? |  |  |  |  |
| 6. Did you have difficulties getting back to sleep? |  |  |  |  |
| 7. Did you wake up earlier than usual? |  |  |  |  |

Subscore 1: $\qquad$

Range for sub-score 1 (Sleep Quality): 7 (good) - 28 (poor)

## Subjective Sleep Quality (SSA-1)

## Normal Healthy Subjects (n:177)



## Subjective Sleep Quality (SSA-1) Normal Healthy Subjects ( $\mathrm{n}: 177$ )




Adaptation night ("model of transient insomnia"):
Increases variance even in healthy subjects

## Subjective Sleep Quality (SSA-1) Normal Healthy Subjects ( $\mathrm{n}: 177$ )



Baseline - adaptation night ("normalization"):
Avoids the problem of interindividual differences in handling rating scales and sleep habits

## Evaluation of "Objective Sleep Quality"

Polysomnographic investigations were analyzed by Somnolyzer 24x7 according to the standard criteria (Rechtschaffen \& Kales 1968; ASDA criteria 1992) and by means of a newly developed continuous hierarchical Gaussian Mixture Model (hGMM) of the sleep process (SENSATION WP 1.4).
-Sleep initiation and maintenance (sleep latency, sleep efficiency, WASO, etc.)
-Sleep continuity (number of awakenings, stage shifts and cortical arousals per hour TST, hGMM stage shifts)
-Sleep architecture (sleep stages in \% of TST; hGMM area under the curve (AUC) or entropy)

## B001402: Male, 34 years







## B003302: Female, 76 years




## "Subjective sleep quality" versus "Objective sleep quality"

SSA-1

## Sleep efficiency

| SLEEP QUALITY | no | slightly | moderately | very much |
| :--- | :---: | :---: | :---: | :---: |
| 1. Did you sleep well ? |  |  |  |  |
| 2. Did you have deep sleep? |  |  |  |  |
| 3. Did you have difficulties in falling asleep? |  |  |  |  |
| 4. Did you have difficulties in staying asleep? |  |  |  |  |
| 5. Did you have bad dreams? |  |  |  |  |
| 6. Did you have difficulties getting back to sleep? |  |  |  |  |
| 7. Did you wake up earlier than usual? |  |  |  |  |

Subscore 1: $\qquad$

Patient's ID:
Patient's gender:
Patient's age:
First Night:

637 aaabe.edf
female
66 years
No

## Controls: SIESTA normative database

Number of controls: $\quad 31$ females
Controls' age: $\quad 66.9 \pm 5.8$ years

Analysis by fraction (1/4):


## "Subjective sleep quality" versus "Objective sleep quality" R\&K <br> SSA-1 <br> Sleep efficiency (\% TIB)



## "Subjective sleep quality" versus "Objective sleep quality" R\&K <br> SSA-1 <br> Sleep efficiency (\% TIB)




## "Subjective sleep quality" versus "Objective sleep quality" <br> R\&K <br> SSA-1 <br> Sleep efficiency (\% TIB)



## "Subjective sleep quality" versus "Objective sleep quality" <br> R\&K <br> SSA-1 <br> Sleep efficiency (\% TIB)






MALE 40-59


MALE $>=60$


FEMALE 40-59


FEMALE $>=60$


SSA-1
versus
R\&K
Sleep efficiency (\% TIB)

Sleep<br>efficiency $=$<br>(100*TST/TIB)

with

TST =
S1+S2+S3+S4+REM
eff1_00c $=3.40+-1.71 *$ s_qua 21 R-Square $=0.40$

FEMALE 40-59


FEMALE >=60


SSA-1
versus
R\&K Sleep efficiency-1 (\% TIB)

Sleep<br>efficiency-1 =<br>(100*TST1/TIB)

with

TST1 =
S2+S3+S4+REM

## SSA-1 versus sleep efficiency (\% TIB) <br> R\&K <br> hGMM



MALE 40-59


MALE >=60


FEMALE 20-39
FEMALE 20-39
eff_00c $=2.41+\mathbf{- 1 . 4 5 ~ * s \_ q u a \_ 2 1 ~}$
R-Square $=0.39$

## FEMALE 40-59

eff_ $00 \mathrm{c}=3.69+-0.81$ * s_qua 21 $R$-Square $=0.16$


MALE 40-59


MALE >=60
FEMALE $>=60$
eff_00c $=3.66+-1.63$ * s_qua 21 $R$-Square $=0.26$


FEMALE 20-39
effcontc $=1.94+-1.44$ * s_qua_21 R-Square $=0.46$


FEMALE 40-59


FEMALE >=60
effcontc $=3.42+-1.63$ * s_qua_21 R-Square $=0.31$


## "Subjective sleep quality" versus "Objective sleep quality"

SSA-1

## Sleep initiation

| SLEEP QUALITY | no | slightly | moderately | very much |
| :--- | :--- | :--- | :--- | :--- |
| 1. Did you sleep well ? |  |  |  |  |
| 2. Did you have deep sleep? |  |  |  |  |
| 3. Did you have difficulties in falling asleep? |  |  |  |  |
| 4. Did you have difficulties in staying asleep? |  |  |  |  |
| 5. Did you have bad dreams? |  |  |  |  |
| 6. Did you have difficulties getting back to sleep? |  |  |  |  |
| 7. Did you wake up earlier than usual? |  |  |  |  |

Subscore 1: $\qquad$

Patient's ID:
Patient's gender:
Patient's age:
First Night:

637 aaabe.edf
female
66 years
No

## Controls: SIESTA normative database

Number of controls: $\quad 31$ females
Controls' age:
$66.9 \pm 5.8$ years

Analysis by fraction (1/4):


## "Subjective sleep quality" versus "Objective sleep quality" R\&K SSA-1 <br> Sleep initiation

|  | Latency from „lights out" to |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| SSA-1 | Sleep <br> onset | 10 min <br> cont. <br> sleep | S1 | S2 | SWS | REM |
| r | .194 | .200 | .217 | .252 | .245 | .171 |
| p | .010 | .008 | .004 | .001 | .001 | .023 |
| N | 177 | 177 | 177 | 177 | .169 | 177 |

## "Subjective sleep quality" versus "Objective sleep quality" R\&K

 SSA-1Sleep latency (min)


## "Subjective sleep quality" versus "Objective sleep quality" R\&K <br> SSA-1 <br> Latency to S2 (min)



## "Subjective sleep quality" versus "Objective sleep quality"

SSA-1

## Sleep maintenance

| SLEEP QUALITY | no | slightly | moderately | very much |
| :--- | :---: | :---: | :---: | :---: |
| 1. Did you sleep well ? |  |  |  |  |
| 2. Did you have deep sleep? |  |  |  |  |
| 3. Did you have difficulties in falling asleep? |  |  |  |  |
| 4. Did you have difficulties in staying asleep? |  |  |  |  |
| 5. Did you have bad dreams? |  |  |  |  |
| 6. Did you have difficulties getting back to sleep? |  |  |  |  |
| 7. Did you wake up earlier than usual? |  |  |  |  |

Subscore 1: $\qquad$

Patient's ID:
Patient's gender:
Patient's age:
First Night:

637 aaabe.edf
female
66 years
No

Controls: SIESTA normative database
Number of controls: 31 females
Controls' age: $66.9 \pm 5.8$ years

Analysis by fraction (1/4):


10 HR

## "Subjective sleep quality" versus "Objective sleep quality" R\&K <br> SSA-1 <br> Sleep maintenance

|  |  |  |  |
| :---: | :---: | :---: | :---: |
| SSA-1 | Wake after <br> sleep onset | Wake within <br> TSP | Wake after final <br> awakening |
| r | .528 | .505 | .211 |
| p | .000 | .000 | .005 |
| N | $\mathbf{1 7 7}$ | 177 | 177 |

## "Subjective sleep quality" versus "Objective sleep quality" R\&K <br> SSA-1 <br> Wake after sleep onset (min)



## "Subjective sleep quality" versus "Objective sleep quality" R\&K <br> SSA-1 <br> Wake after sleep onset (min)



## "Subjective sleep quality" versus "Objective sleep quality" <br> R\&K <br> SSA-1 <br> Wake after sleep onset (min)






SSA-1
versus
R\&K
Wake after sleep onset (min)

## "Subjective sleep quality" versus "Objective sleep quality"

SSA-1

## Sleep continuity

| SLEEP QUALITY | no | slightly | moderately | very much |
| :--- | :---: | :---: | :---: | :---: |
| 1. Did you sleep well ? |  |  |  |  |
| 2. Did you have deep sleep? |  |  |  |  |
| 3. Did you have difficulties in falling asleep? |  |  |  |  |
| 4. Did you have difficulties in staying asleep? |  |  |  |  |
| 5. Did you have bad dreams? |  |  |  |  |
| 6. Did you have difficulties getting back to sleep? |  |  |  |  |
| 7. Did you wake up earlier than usual? |  |  |  |  |

Subscore 1: $\qquad$

Siesta Spot Report ${ }^{\text {TM }}$

Patient's ID:
Patient's gender:
Patient's age:
First Night:

637 aaabe.edf
female
66 years
No

## Controls: SIESTA normative database

Number of controls: $\quad 31$ females
Controls' age: $\quad 66.9 \pm 5.8$ years

Analysis by fraction (1/4):


## "Subjective sleep quality" versus "Objective sleep quality" R\&K - ASDA <br> SSA-1 <br> Sleep continuity

|  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| SSA-1 | Number of <br> awakenings | Number of <br> awakenings <br> per hr | Number of <br> stage <br> shifts | Number of <br> stage shifts <br> per hr | Number of <br> arousals <br> per hr |
| r | .200 | .328 | -.118 | .186 | .007 |
| p | .006 | .000 | .118 | .013 | .931 |
| N | 177 | 177 | 177 | 177 | .169 |

## "Subjective sleep quality" versus "Objective sleep quality" R\&K <br> SSA-1 <br> Number of awakenings (/hr TST)



## "Subjective sleep quality" versus "Objective sleep quality" R\&K <br> SSA-1 <br> Number of awakenings (/hr TST)



## "Subjective sleep quality" versus "Objective sleep quality" <br> R\&K <br> SSA-1 <br> Number of awakenings (/hr TST)





MALE 20-39


MALE 40-59
fwtst00c $=0.19+0.15$ * s_qua_21 R-Square $=0.17$


MALE >=60


FEMALE 20-39
fwtst00c $=-0.33+0.22$ * s_qua_21 R-Square $=0.41$

FEMALE 40-59
fwtst00c $=-0.47+0.14$ * s_qua 21 R-Square $=0.13$


FEMALE $>=60$


SSA-1
versus
R\&K Number of awakenings (/hr TST)

## "Subjective sleep quality" versus "Objective sleep quality" ASDA

## SSA-1

## Number of arousals (/hr TST)





## "Subjective sleep quality" versus "Objective sleep quality" R\&K <br> SSA-1 <br> Number of stage shifts (/hr TST)





## "Subjective sleep quality" versus "Objective sleep quality" hGMM <br> SSA-1 <br> Number of stage shifts "deep - S2"





## "Subjective sleep quality" versus "Objective sleep quality"

SSA-1

## Sleep architecture

| SLEEP QUALITY | no | slightly | moderately | very much |
| :--- | :--- | :--- | :--- | :--- |
| 1. Did you sleep well ? |  |  |  |  |
| 2. Did you have deep sleep? |  |  |  |  |
| 3. Did you have difficulties in falling asleep? |  |  |  |  |
| 4. Did you have difficulties in staying asleep? |  |  |  |  |
| 5. Did you have bad dreams? |  |  |  |  |
| 6. Did you have difficulties getting back to sleep? |  |  |  |  |
| 7. Did you wake up earlier than usual? |  |  |  |  |

Subscore 1: $\qquad$

Siesta Spot Report ${ }^{\text {TM }}$

Patient's ID:
Patient's gender:
Patient's age:
First Night:

637 aaabe.edf
female
66 years
No

Controls: SIESTA normative database
Number of controls: $\quad 31$ females
Controls' age:
$66.9 \pm 5.8$ years

Analysis by fraction (1/4):


10 HR

## "Subjective sleep quality" versus "Objective sleep quality" R\&K <br> SSA-1 Sleep architecture

|  | Total Night - Stage in \% of TST |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
| SSA-1 | S1 | S2 | SWS | REM |
| r | .327 | -.126 | -.036 | -.097 |
| p | .000 | .096 | .631 | .200 |
| N | 177 | 177 | 177 | 177 |

## "Subjective sleep quality" versus "Objective sleep quality" R\&K <br> SSA-1 <br> Sleep architecture

|  | $1^{\text {st }}$ Quarter of the Night - Stage in \% of TST |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
| SSA-1 | S1 | S2 | SWS | REM |
| r | .284 | -.030 | -.240 | -.071 |
| p | .000 | .688 | .001 | .350 |
| N | 177 | 177 | $\mathbf{1 7 7}$ | 177 |

## "Subjective sleep quality" versus "Objective sleep quality" R\&K: $1^{\text {st }}$ quarter of the night SSA-1 Slow-wave sleep (\% TST)



## "Subjective sleep quality" versus "Objective sleep quality" R\&K: $1^{\text {st }}$ quarter of the night <br> SSA-1 Slow-wave sleep (\% TST)




## "Subjective sleep quality" versus "Objective sleep quality" R\&K: $1^{\text {st }}$ quarter of the night <br> SSA-1 Slow-wave sleep (\% TST)






SSA-1
versus
R\&K
SWS
$1^{\text {st }}$ quarter (\% TST ${ }_{1}$ )

## "Subjective sleep quality" versus "Objective sleep quality" hGMM <br> SSA-1 <br> Sleep architecture

|  | Total Night - AUC in \% of TSP |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
| SSA-1 | rAUC-S1 | rAUC-S2 | rAUC-Deep | rAUC1-Deep |
| r | 0.321 | -0.312 | -.289 | -.396 |
| p | 000 | 000 | .000 | .000 |
| N | 176 | 176 | 176 | $\mathbf{1 7 6}$ |

## "Subjective sleep quality" versus "Objective sleep quality" hGMM <br> SSA-1 <br> rAUC $1^{\text {st }}$ derivative deep (\% TSP)



## "Subjective sleep quality" versus "Objective sleep quality" hGMM <br> SSA-1 <br> rAUC $1^{\text {st }}$ derivative deep (\% TSP)



## "Subjective sleep quality" versus "Objective sleep quality" hGMM <br> SSA-1 <br> rAUC $1^{\text {st }}$ derivative deep (\% TSP)




0.0800 rauc1_dc $=\mathbf{- 0 . 0 0}+\mathbf{- 0 . 0 0}$ *s_qua_21 $R$-Square $=0.12$


MALE 40-59
0.0800 rauc1_dc $=\mathbf{- 0 . 0 0 + - 0 . 0 0}$ *s_qua_21 $R$-Square $=0.33$


MALE $>=60$

rauc1_dc $=-0.00+-0.00$ * s_qua 21 R-Square $=0.12$


FEMALE 40-59
rauc1_dc $=0.00+-0.00$ * s_qua_21 R-Square $=0.06$


FEMALE $>=60$


SSA-1

## versus

hGMM
rAUC $1^{\text {st }}$ deriv. deep (\% TSP)

## "Subjective sleep quality" versus "Objective sleep quality" R\&K <br> SSA-1 <br> Sleep architecture

|  | $2^{\text {nd }}$ Quarter of the Night - Stage in \% of TST |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
| SSA-1 | S1 | S2 | SWS | REM |
| r | .303 | -.087 | -.004 | $\mathbf{- . 1 6 2}$ |
| p | .000 | .252 | .955 | .031 |
| N | 177 | 177 | 177 | $\mathbf{1 7 7}$ |

## "Subjective sleep quality" versus "Objective sleep quality" R\&K: $2^{\text {nd }}$ quarter of the night <br> SSA-1 REM sleep (\% TST)



## "Subjective sleep quality" versus "Objective sleep quality" R\&K: $2^{\text {nd }}$ quarter of the night <br> SSA-1 REM sleep (\% TST)



## "Subjective sleep quality" versus "Objective sleep quality" R\&K: $2^{\text {nd }}$ quarter of the night SSA-1 REM sleep (\% TST)






MALE 40-59


MALE >=60


FEMALE 20-39
remp_24c $=5.53+-0.89$ * $s \_q u a \_21$ R-Square $=0.13$


FEMALE 40-59


FEMALE $>=60$


SSA-1
versus
R\&K REM $2^{\text {nd }}$ quarter (\% TST ${ }_{2}$ )

## "Subjective sleep quality" versus "Objective sleep quality"

## CONCULSION - I

Even in "good" sleepers, the adaptation night introduced sufficient variance in sleep quality for a meaningful analysis.

Correlation analysis based on change values (2 $2^{\text {nd }}-1^{\text {st }}$ PSG night) reduced the problem of interindividual differences in handling rating scales and sleep habits.

Sleep efficiency based on R\&K and hGMM explains approximately 25\% of the observed variance in subjective sleep quality, independent of subjects' sex and age.

## "Subjective sleep quality" versus "Objective sleep quality"

## CONCULSION - II

Measures for sleep continuity and architecture based on R\&K showed significant correlations with subjective sleep quality only in young subjects.

In contrast, measures for sleep continuity and architecture based on hGMM showed significant correlations in all age-groups by exploiting the high temporal resolution (number of stage shifts) and by utilizing amplitude-independent measures (deep sleep).

Thus, the new continuous probabilistic hierarchical Gaussian Mixture Model (hGMM) provides additional complementary sleep characteristics.

