

Assessing sleep regularity: theoretical and practical implications of available metrics

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Background

Irregular sleep, a proxy for circadian disruption in the field, has been associated with adverse health effects¹. Sleep regularity has been assessed by focusing on average sleep-wake patterns, using metrics such as standard deviation (**StDev**), Interdaily Stability (**IS**)², and Social Jet Lag (**SJL**)³. Novel metrics have been proposed to instead capture variability between consecutive days: the Composite Phase Deviation (**CPD**)⁴ and the Sleep Regularity Index (**SRI**)⁵. We systematically compared these metrics across different sources of daily variability (e.g., naps, awakenings), number of days and participants.

Methods

Sleep-wake patterns were synthetically generated over 2-28 days with weekday-weekend differences. Daily sleep variability was introduced by randomly drawing daily midsleeps and/or sleep durations from a normal distribution with standard deviation ranging from 0-120 min. Average estimates and 95% confidence intervals (CIs) were calculated for: 'scrambling' the order of sleeps; fragmented sleep: naps and wake after sleep onset (WASO); "all-nighters" (nights with no sleep); and different study lengths (2-28d). Sample sizes were determined for two-group comparisons (i.e. regular vs. irregular sleepers) using Welch's t-test.

1) Metrics measure on different time scales:

global vs. circadian metrics.

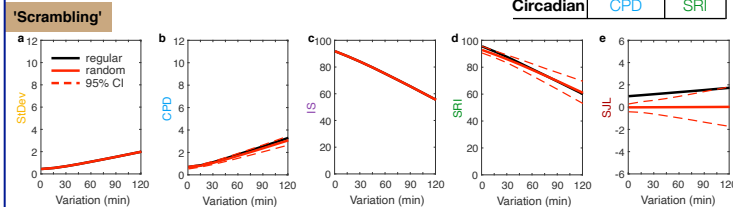


Figure 2. Global vs. circadian metrics. When sleep episodes were randomly re-ordered, **StDev** (a) and **IS** (c) remained identical, whereas **CPD** (b) and **SRI** (d) were affected, showing that the metrics measure on different time scales: **StDev/IS** measure on a **global scale** returning the same values irrespective of day-to-day changes, whereas **CPD/SRI** measure on a **circadian scale** capturing changes between consecutive days. Scrambling removed the weekday-weekend difference and thus **SJL** (e) equaled zero.

2) Metrics integrate different amounts of data:

deviation vs. overlap metrics.

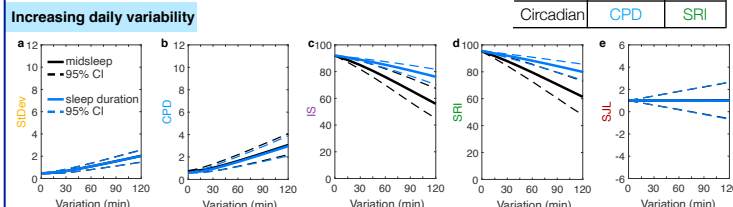
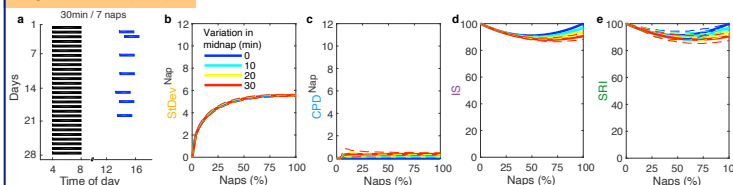


Figure 3. Deviation vs. overlap metrics. **StDev** (a) and **CPD** (b) use values derived from sleep-wake patterns to quantify the deviation of daily sleep from reference sleep (**deviation metrics**), whereas **IS** (c) and **SRI** (d) use the entirety of sleep-wake patterns to quantify the overlap between daily patterns and the average pattern (**IS**), respectively, between adjacent patterns (**SRI**) (**overlap metrics**). **SJL** (e) is a measure of weekly but not daily sleep regularity (values do not change with increasing daily variability).
i) Overlap (but not deviation) metrics' range is wider for daily variability in midsleep vs. duration.
ii) Overlap (but not deviation) metrics integrate variability from multiple sources (midsleep AND duration).

3) Overlap, but not deviation, metrics assess fragmented sleep.

Fragmented sleep: naps



Fragmented sleep: WASO

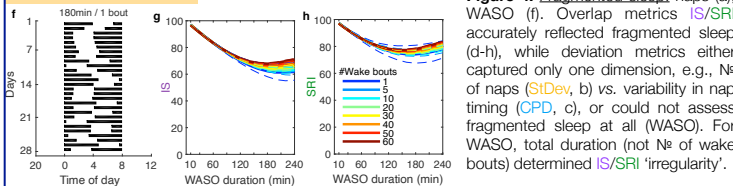


Figure 4. Fragmented sleep: naps (a), WASO (f). Overlap metrics **IS/SRI** accurately reflected fragmented sleep (d-h), while deviation metrics either captured only one dimension, e.g., N_{e} of naps (**StDev**, b) vs. variability in nap timing (**CPD**, c), or could not assess fragmented sleep at all (WASO). For WASO, total duration (not N_{e} of wake bouts) determined **IS/SRI** 'irregularity'.

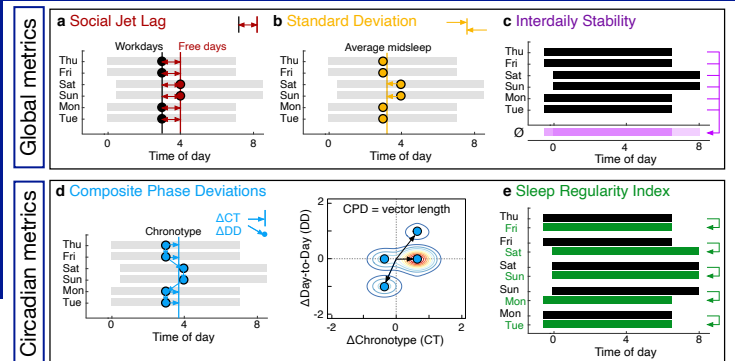


Figure 1. Sleep regularity metrics. Global metrics **SJL** (a), **StDev** (b), and **IS** (c) quantify overall sleep variability, comparing each day to the average, whereas circadian metrics **CPD** (d) and **SRI** (e) quantify variability between days, comparing each day to the next.

4) IS assesses stability, not regularity, of sleep-wake rhythms.

'All-nighters'

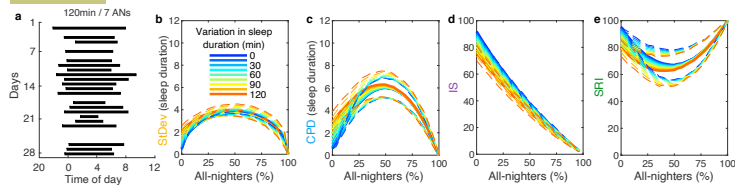


Figure 5. Stability vs. regularity. With increasingly absent sleep (a), values of **StDev** (b), **CPD** (c), and **SRI** (e) returned to a 'perfectly regular' score for constant wakefulness, whereas **IS** yielded monotonically lower ('less regular') values, suggesting that **IS** does not assess the regularity of a sleep-wake pattern without consideration of its 'stability': for a sleep-wake rhythm to be regular, both sleep and wakefulness need to be present.

5) Global metrics require relatively many days for an accurate estimate, whereas circadian metrics require larger samples.

Study length

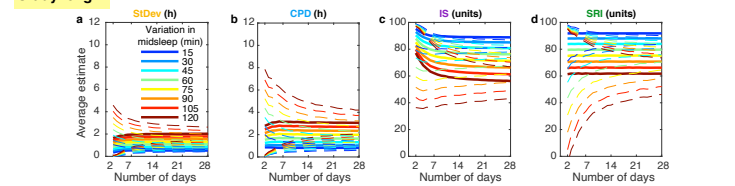


Figure 6. Number of days. Global metrics were less stable over the first 7 days than circadian metrics: **StDev/IS** changed up to 33%/39% (a,c) vs. **CPD/SRI** up to 9%/1% (b,d) (compared with mean at 28d). While 95% CIs narrowed with more days for all metrics, **CPD/SRI** had generally wider CIs than **StDev/IS**, due to circadian metrics measuring on a day-to-day timescale.

Sample size

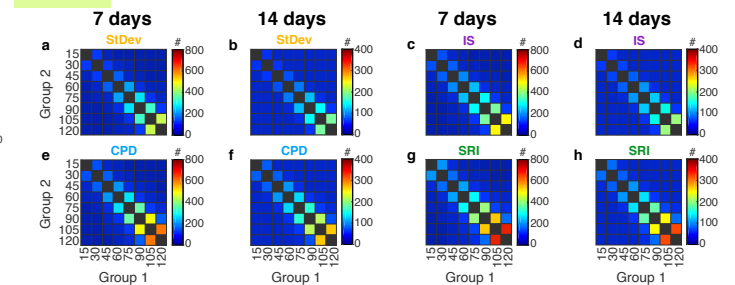


Figure 7. Number of participants. Due to their wider CIs, **CPD/SRI** (e-h) required on average 20% larger sample sizes than **StDev/IS** (a-d) but that number decreased with more days (e.g., 12% for 28-d patterns). Sample sizes were not increased for **CPD/SRI** when comparing groups of very different sleep regularity (dark-blue cells, i.e., regular vs. irregular sleepers).

Wrap-up

The metrics measure different aspects of sleep regularity and should be seen as complementary rather than competitive. Global metrics require relatively many days for an accurate estimate, whereas circadian metrics require larger samples. Selecting a metric will need to balance study length and sample size. Studies should include more than one metric to capture different aspects of sleep regularity and examine its potential as a proxy for circadian disruption in the field.