



ELSEVIER

Available online at [www.sciencedirect.com](http://www.sciencedirect.com)

ScienceDirect

Behavioral  
Sciences

# Limitations on visual information processing in the sleep-deprived brain and their underlying mechanisms

Michael WL Chee

Sleep deprivation (SD) which has become more prevalent globally, impairs various aspects of cognition. Slowing of visual processing, loss of selective attention, distractor inhibition, visual short-term memory and reduced peripheral processing capacity are associated with diminished engagement of fronto-parietal regions mediating top-down control of attention as well as selectively reduced visual extrastriate cortex activation. The onset of 'local sleep' following sustained wakefulness could account for these, as well as time-on-task effects. Concurrently, alterations in cortical-cortical as well as thalamo-cortical connectivity can disrupt the flow of sensory information from the periphery to association cortex responsible for higher order cognition. Our ability to process visual stimuli is compromised when sleep deprived, even during the periods when we are apparently responsive.

## Addresses

Center for Cognitive Neuroscience, Neuroscience & Behavioral Disorders Program, Duke-NUS Graduate Medical School, Singapore

Corresponding author: Chee, Michael WL  
([michael.chee@duke-nus.edu.sg](mailto:michael.chee@duke-nus.edu.sg))

**Current Opinion in Behavioral Sciences** 2015, 1:56–63

This review comes from a themed issue on **Cognitive neuroscience**

Edited by **Cindy Lustig** and **Howard Eichenbaum**

For a complete overview see the [Issue](#) and the [Editorial](#)

Available online 25th October 2014

<http://dx.doi.org/10.1016/j.cobeha.2014.10.003>

2352-1546/© 2014 The Author. Published by Elsevier Ltd. This is an open access article under the CC BY-NC-ND license (<http://creativecommons.org/licenses/by-nc-nd/3.0/>).

## Introduction

Voluntary sleep loss arising from lifestyle choices is prevalent [1] despite it producing an unpleasant mental fog, fatigue and sleepiness that elevate the likelihood of accidents [2], cognitive errors [3\*\*] and emotional dysregulation [4]. Understanding the neural mechanisms underlying behavioral changes in the sleep-deprived state may be of benefit in reducing their negative impact. A good place to begin is to examine a faculty that is very consistently affected by this state – degradation of vigilance after a night of total sleep deprivation (SD) [5]. While highly valued high-order cognitive functions like executive function and memory can also be diminished when we are sleep-deprived, their degradation is likely to

be subordinate to deficits in the basic ability to stay awake and perceive the external world [3\*\*,6,7].

To the casual observer, a sleep-deprived person appears tired but otherwise able to function until they momentarily falter when briefly falling asleep. 'Wake-state instability' [8] is an influential concept which posits that the sleep-deprived brain toggles from between 'awake' and 'asleep' in a matter of seconds [9]. This aptly describes the seemingly preserved ability to respond at times while being profoundly impaired at others. Less obvious, and an important theme in this review, is evidence for degraded ability to process sensory stimuli when sleep-deprived, even during the periods when we are apparently responsive. A mechanism that can reconcile the seemingly disparate accounts of both intermittently and continuously degraded behavior in sleep deprivation is 'local sleep' (elaborated on later) which ultimately results in reduced attentional capacity.

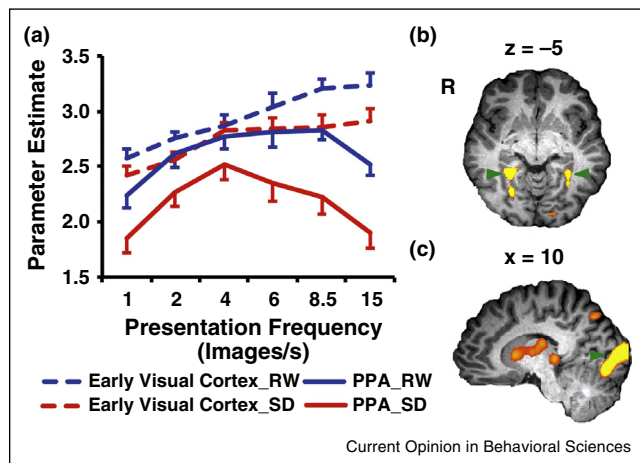
Degraded attention, insofar as it refers to 1) reduced capacity to process the stream of information our senses are continually presented with, and 2) an impaired ability to channel these limited resources to specific goals, is a useful framework for studying the neurobehavioral changes accompanying sleep deprivation (SD). As attention serves to enhance sensory processing [10], decreased functionality of fronto-parietal areas that exert top-down effects on sensory cortex can be expected to contribute to poorer perceptual performance. This review will focus on aspects of attention and/or visual processing that are altered by overnight total sleep deprivation.

## Slower processing of rapidly presented pictures

The human visual system processes information with amazing rapidity, enabling us to identify a single flashed object appearing for as briefly as 20 ms. Examining neural responses to Rapid Serial Visual Presentation (RSVP) of pictures is an intuitive method to identify areas that evidence temporal limits in visual processing. Being able to process serially presented images briefly separated in time is of interest given the relevance of this faculty in tasks performed by sleep-deprived persons such as threat detection or rapid radiologic diagnosis.

The hierarchical organization of visual cortex is such that higher visual areas take time to integrate information relayed from early visual areas (Einhauser et al., 2007, Todd et al., 2011). As such, while a faster stream of novel pictures (e.g. 4 frames/s) increases sensory stimulation and

Figure 1



(A) Temporal response profiles across state in Parahippocampal Place Area (PPA). Parameter estimates are in arbitrary units. Group activation map showing the PPA. (B) Temporal response profiles across state in the early visual cortex. (C) Group activation map showing early visual cortex, thresholded at  $p < 0.000005$ , uncorrected. Note that the y-axis scale has been cropped to optimally display relevant activation magnitude values in the PPA and early visual cortex. (Adapted from Kong et al. [13]).

can elicit more activation in higher visual areas, further increasing presentation rate (e.g. 15 frames/s) will result in failure to adequately process complex information, giving rise to an inverted u-shaped temporal response profile. Using this approach, the parahippocampal place area (PPA) and fusiform face areas (FFA) whose response profiles peak at the slower rates relative to earlier visual areas have been identified as bottlenecks for visual processing [11,12]. Lowered rate of visual processing in SD is evidenced by a slower peak rate in the temporal response profile in the PPA compared to in the well rested state [13]. The PPA and FFA lie in extrastriate visual cortex and are relatively more sensitive to the degradation of top-down control of attention encountered during SD. In contrast, early visual areas where processing is not limited at the presentation frequencies tested and which are less sensitive to attentional modulation, demonstrate a monotonic increase in activation with presentation rate irrespective of state (Figure 1). Hence, visual areas that serve as potential bottlenecks for visual processing in the sleep-deprived state can be identified.

### Impaired selection

Selectivity for object pictures can be measured by examining the difference in PPA responses to attended and unattended house pictures. This index of selectivity is lowered in sleep-deprived persons, when picture stimuli are temporally unpredictable [14]. However, when face and house stimuli appear in a temporally predictable manner, SD results in reduced PPA activation but without an accompanying change in selectivity [15]. This

relative improvement in behavioral performance when stimuli are temporally predictable is consistent with similar effects found with vigilance in the well rested state [16].

Reduced spatial selective attention in SD also occurs in the preparatory period preceding stimulus onset and manifests in retinotopically specific visual cortex [17]. The latter indicates that effects of SD manifest in brain areas specifically engaged in the task and are not evident when these areas are not specifically probed. Deficits in attention evidenced by reduced fronto-parietal activation in association with degraded performance are also evident in visual tracking tasks that evaluate deployment of selective attention over a longer period than that spanned by a brief experimental trial [18,19]. These point to a temporally more extensive loss of top-down control of attention than apparent from tests of psychomotor vigilance.

### Reduced processing of peripheral information

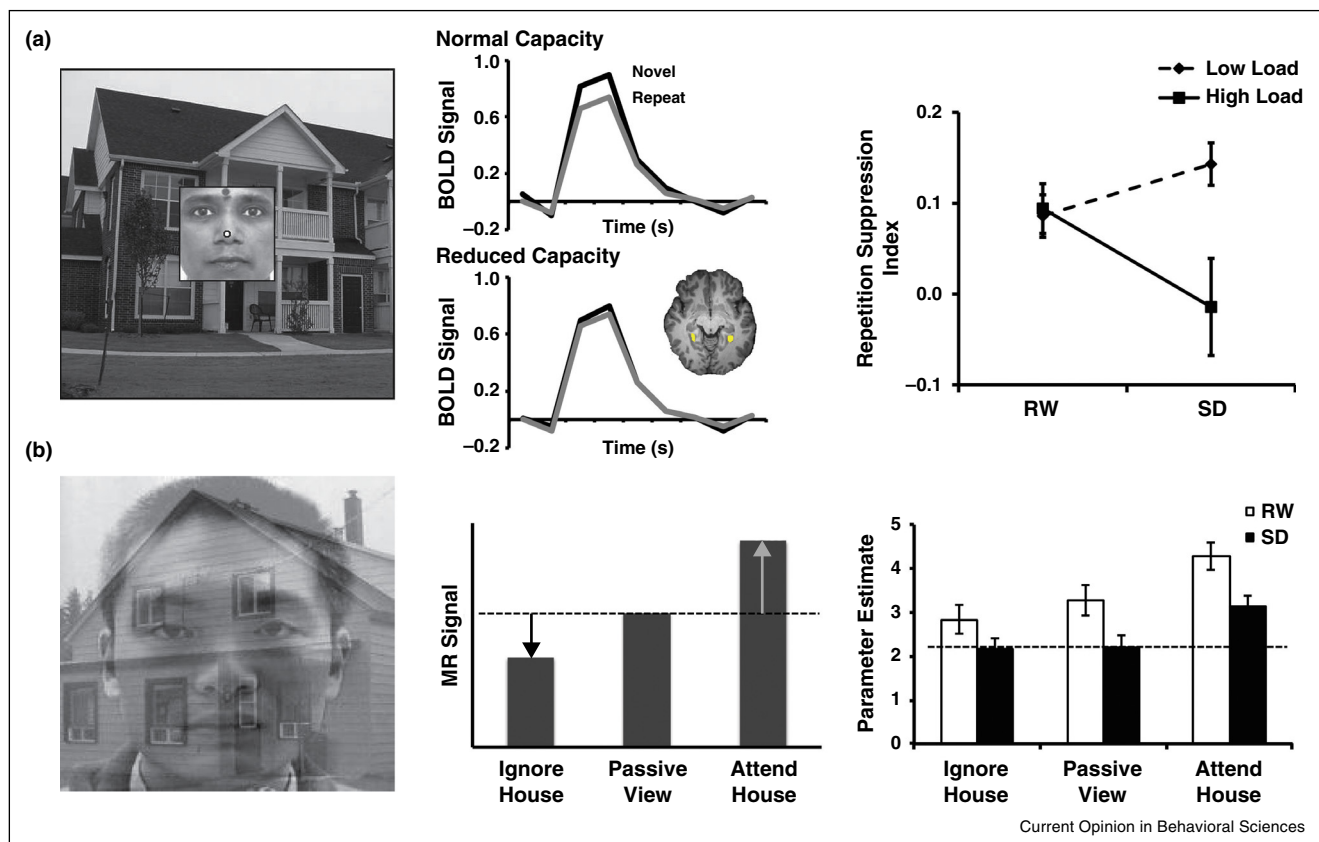
The Perceptual Load Theory of attention [20] proposes that focusing attention on a task-relevant stimulus will restrict the processing of task-irrelevant distractors according to the availability of residual perceptual processing capacity. Conversely, if a task-relevant stimulus places low demands on the perceptual system, spare capacity becomes available to process unattended distractors [21–23]. Experiments exploiting this framework typically involve a central target and peripheral distractors, a scenario akin to keeping focused on the traffic warden at a crossing while still being able to detect a child who strays onto the opposite side of the road.

The amount of processing appropriated to unattended distractors can be inferred from the magnitude of fMRI repetition suppression associated with distractor repetition [24]. The availability of resources for processing unattended stimuli can be manipulated by varying the perceptual clarity of the central target. Consistent with a state related reduction in peripheral processing capacity, sleep deprivation attenuated repetition suppression to peripheral pictures when central perceptual load was high but not when perceptual load was low [25]. This contrasts with the situation with rested participants where sufficient capacity is available such that perceptual load has no significant effect on repetition suppression (Figure 2A).

### Impaired inhibition of distractors

Selective attention can be dissociated into enhancement of task-relevant information, and suppression of distractions/task-irrelevant information [26,27]. By keeping sensory input constant and manipulating the object of attention using ambiguous, overlapping face and house pictures [28], target facilitation and distractor suppression can be dissociated [29]. In addition to the robust finding

Figure 2



**(A)** Sleep deprivation and reduced perceptual processing capacity. A series of scene–face composite pictures were shown. Faces were either undistorted (low-load condition) or degraded (high-load condition). Surrounding each face were either alternately repeated or novel background scenes. Activation in the PPA corresponding to repeated or non-repeated house pictures depicting repetition suppression when perceptual processing capacity is normal or compromised. Repetition suppression was reduced under conditions of high perceptual load during SD (Adapted from Kong et al. [25].) **(B)** Sleep deprivation results in attenuated suppression of distractors. The schematic shows an example of an ambiguous face/house whose activation in PPA was compared across three conditions: attend face, ignore house (AFIH), and attend house, ignore face (AHIF). Passive viewing of ambiguous pictures served as the control condition (CTRL). The middle schematic shows expected patterns of target enhancement and distractor suppression in the rested state. The last panel shows that enhancement of attended houses was relatively preserved but suppression of distractor houses was impaired during SD. RW = Rested wakefulness, SD = Sleep deprivation (from Kong et al. [29]).

that PPA activation is reduced by SD, there is a selective deficit in suppression of PPA activation to ignored houses, sparing enhancement of PPA activation to attended houses [29\*] (Figure 2B). This observation parallels studies of cognitive aging that highlight similar deficits in distractor suppression [30–32]. Suppressing distraction and keeping to task goals can be thought of as an executive function with *perceptual* consequences, for example, in the case of deficient filtering of target memoranda during tests of visual short-term memory [33] or with increased head turns toward peripheral distracting events during SD [34].

#### Impaired visual short-term memory

The ability to maintain a sensory representation for several seconds is crucial for enabling goal-directed behavior and is a core feature of attention [35]. This

function is served by a capacity-limited visual short-term memory (VSTM). Most individuals are only able to store about four visual items at a time [36]. If short-term memoranda fail to be maintained over brief delays, critical items that we need queued for this manipulation task will be unavailable, thus degrading higher order cognitive functions which require access to such memoranda. Visual short-term memory capacity was reduced after a night of total sleep deprivation in two studies [37,38] but not in a third [33] where the circadian contribution to performance degradation could have been smaller. Interestingly, during sleep deprivation, cortical activation in the intraparietal sulcus that participates in short-term storage is lowered irrespective of memory load [37,38]. This suggests that fewer functional circuits (see later) are available for recruitment during SD.

Beyond the measurement of ‘capacity’, the qualitative aspects of short-term memory representations also matter [39]. Having participants maintain the location and color of three stimuli over a delay and then to report the color of the item at the cued location was used to assay memory precision. SD did not impair the precision of representations held in VSTM. However extending the retrieval delay to 10 s from 1 s reduced capacity [40].

The maintenance of short-term visual representations is thought to depend on recurrent reverberatory activity within cortical regions involved in sensory perception [41] and fronto-parietal regions involved in maintaining attention [42]. The probability that such representations fail with delay increases as the fronto-parietal [43\*\*] and extrastriate areas [44] that support VSTM undergo random dropouts in neuronal firing during SD.

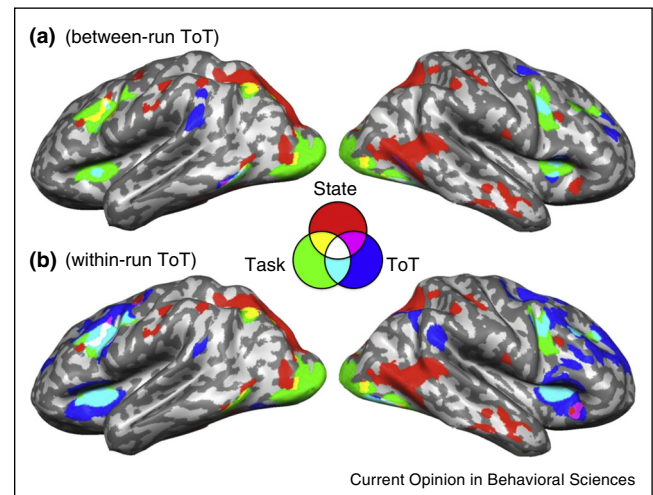
### Intensified time-on-task effects

Behavioral studies of vigilant attention show that SD and time-on-task (ToT) interact to decrease performance [45,46,47\*]. This interaction suggests that similar processing stages and, perhaps, similar brain regions may underlie such declines. Indeed, frontal and parietal regions show activation declines in a broad array of SD [18,37,48] and ToT studies [19\*,49–51]. With sleep restriction, ToT effects and those arising from transient tracking errors can be differentiated [19\*]. A direct comparison of the neural correlates of SD and ToT effects has also shown that these both involve a partially overlapping subset of task-activated regions (Figure 3), including frontal-parietal attention regions and ventral visual cortex [52\*].

A possible explanation is that attentional circuits become fatigued with repeated use [47\*,53]. This use-dependency account suggests that either prolonged wake or sustained task engagement exhausts the neural circuits supporting attention [54\*]. Resource theories of the time on task effect are consistent with this account, as they argue that sustained attention requires effort and therefore drain cognitive resources [45,55]. These same resources are limited during SD [25,29\*], leading to more severe ToT effects. Interestingly, even a brief ~1-min break between experimental runs is sufficient to return stimulus detection to almost baseline levels *for that state* [7].

While SD and ToT can both impair participant motivation, and lead to poorer performance [49,56] experimental participants typically evidence continued effort through an increase in false alarms as the target detection rates drop. Such results suggest a shift in detection ability, rather than complete failure to engage with the task [8,57]. This is consistent with the broader thesis that in addition to obvious ‘wake-state instability’, information

Figure 3



Overlap of BOLD activation associated with task, state, and time-on-task. (A) Overlaps for between-run time-on-task. (B) Overlaps for within-run time-on-task. Note the three-way overlapping of activation in the middle frontal gyrus and ventral visual cortex (From Asplund et al. [52\*]).

processing in sleep-deprived persons is ‘tonically’ impaired as well (Figure 4).

### Changes in resting-state connectivity

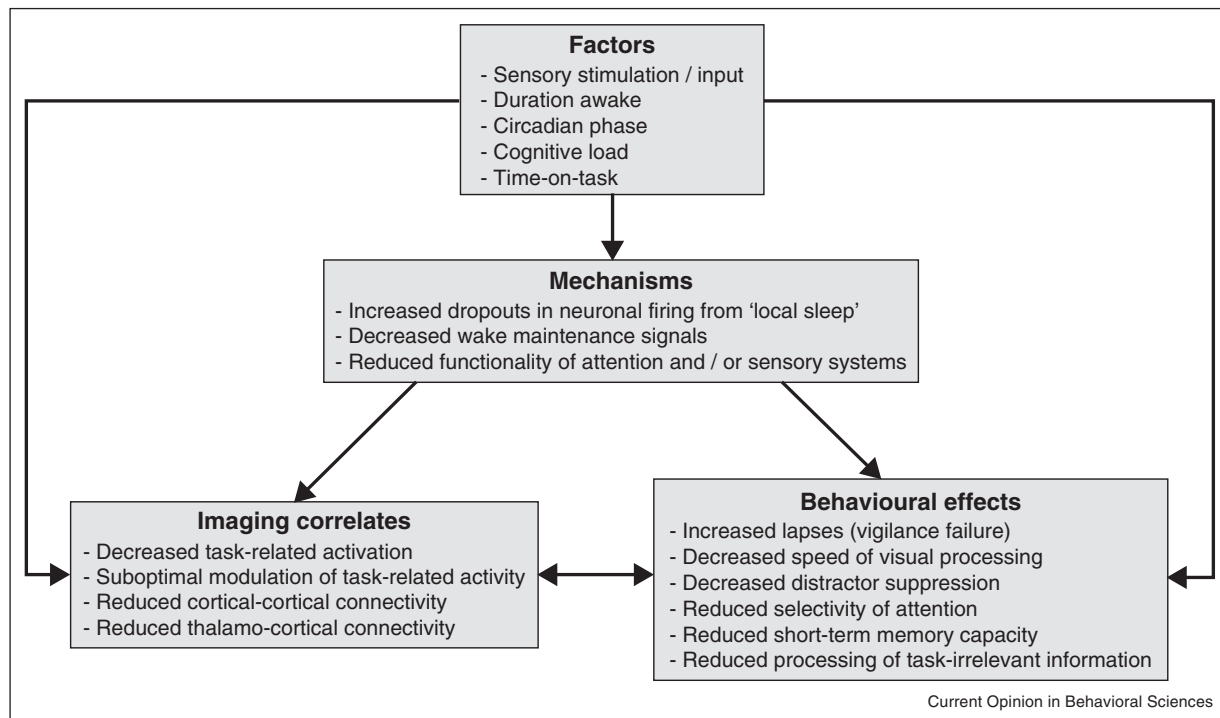
Changes in resting state functional connectivity occur in sleep-deprived persons [58\*,59] alongside alterations to how the default mode network (DMN) or parts of it are engaged during tasks [13\*,37,60,61]. Changes in resting state connectivity provide another major systems level explanation for degraded behavioral performance in SD. Examining resting state networks, in theory, affords the identification of brain areas affected by SD but which are not revealed with task-related fMRI because the task used does not engage them.

Reduced connectivity within the DMN and reduced anti-correlation between the DMN and ‘task-positive’ networks like the dorsal attention network has been robustly reproduced [58\*,59,62,63]. Changes in resting state connectivity in the sleep-deprived state appear to be consistent with those occurring along the descent from wakefulness to light sleep [64\*,65] and can be distinguished from those associated with deeper stages of NREM sleep [65,66].

Increased daytime sleepiness in young adults and cognitively intact older adults appears to be correlated with reduced DMN connectivity [67]. However, changes in DMN connectivity appear less clearly correlated with reduced performance in SD compared to state shifts in task-related activation [57].



Figure 4



Schematic showing the inter-relationships between relevant environmental or endogenous factors affecting arousal, putative mechanisms that influence cognitive processing capability, neuroimaging features and neurobehavioral manifestations of sleep deprivation.

Reduced thalamo-cortical connectivity is an important change occurring in the transition from wake to sleep [65,68], as well as in sleep-deprived persons [69]. This disconnection of association cortex from afferent sensory inputs could contribute to the reduced perceptual sensitivity described in a number of studies reviewed here. However, it remains to be confirmed whether an increased 'small-worldness' in connectivity where short-range connectivity is enhanced and long-range connectivity is reduced, is an adaptive change [70] or merely an epiphenomenon.

Pattern analysis on a large number of participants suggests that N1 (very light sleep) frequently intrudes into resting state studies on 'awake' participants [71<sup>••</sup>]. This might contribute to inter-individual differences in behavioral performance even in seemingly well-rested and alert persons.

#### Reduced functional circuits in SD: the 'local sleep' hypothesis

Might there be a common mechanism that could underlie this diverse set of neurobehavioral observations? We could begin by noting that sleep deprivation consistently lowers task-related activation of the intraparietal sulcus and the lateral occipital parts of extrastriate cortex. The extent of this decrement correlates with decline in

psychomotor vigilance [48] and its relief by cholinergic augmentation [38,72] corresponds with benefit on behavioral performance. A functional relationship between intervention and neuroimaging change was also found when rTMS was applied to the right lateral occipital region [73<sup>•</sup>].

Thus, there appears to be a reduction in the number of functional cortical circuits available to process visual information during SD. A 'functional circuit', refers to the assembly of neurons activated during the performance of a particular task. It could include neurons in close proximity, for example, those in visual cortex, as well as clusters connected by long-range fibers, such as those in frontal and parietal areas mediating attention.

Sustained wakefulness results in an increase in homeostatic sleep pressure resulting in 'local sleep' where circumscribed patches of cerebral cortex demonstrate physiological features of sleep in drowsy but still responsive animals [44,74]. Goal directed behavior like reaching, is more likely to fail during periods when clusters of frontal and parietal neurons show transient reductions in multi-unit activity [43<sup>••</sup>].

In human volunteers, correct responses elicit lower BOLD signal changes in the sleep-deprived state than

in the rested state. This suggests that in the rested state, there may be some redundancy in circuit activation allowing for random failures without compromising behavioral performance. When sleep-deprived, this reserve is reduced, leading to occasional behavioral lapses.

This ‘local sleep’ account of neurobehavioral degradation in SD is attractive in that it is relevant in both top-down or bottom-up sensory system failure accounts of degraded performance as well as time-on-task effects. However, at the present time, it is unclear whether ‘local sleep’ triggers altered connectivity or, if brainstem, hypothalamic and basal forebrain structures are the originators of lower cortical connectivity and reduced cortical activation [9,75]. Newer methods to evaluate ‘dynamic functional connectivity’ [76\*\*] over temporal windows spanning seconds instead of minutes using both fMRI and EEG promise to shed light on this open question.

## Conclusions

Deficits in visual perception or visual processing capacity are central to explaining neurobehavioral changes in sleep deprivation. Reduced engagement of fronto-parietal regions that mediate top-down control of attention has been demonstrated in multiple experiments evaluating different facets of attention and visual processing capacity. Independently of, or consequent to this, visual extrastriate cortex activation is markedly reduced. The onset of ‘local sleep’ at random intervals in these heavily engaged brain areas following sustained wakefulness could account for the observed reduction in task-related activation. Concurrently, several changes in cortical-cortical as well as thalamo-cortical connectivity can disrupt the normal passage of sensory information to association cortex. Over minutes, these physiological changes can be reliably distinguished from rested wakefulness. However, from trial-to-trial, on a temporal scale of seconds, they appear more stochastic, having the characteristics of ‘wake-state’ instability. Additional exploration of the sleep-deprived state will continue to contribute novel insights into impaired brain function.

## Conflict of interest

Nothing declared.

## Acknowledgements

This work was supported by a grant awarded to Dr. Michael Chee from the National Medical Research Council Singapore (STaR/0004/2008).

## References and recommended reading

Papers of particular interest, published within the period of review, have been highlighted as:

- of special interest
- of outstanding interest

1. Basner M, Dinges DF: **Dubious bargain: trading sleep for Leno and Letterman.** *Sleep* 2009, **32**:747-752.
2. Balkin TJ, Horrey WJ, Graeber RC, Czeisler CA, Dinges DF: **The challenges and opportunities of technological approaches to fatigue management.** *Accid Anal Prev* 2011, **43**:565-572.
3. Basner M, Rao H, Goel N, Dinges DF: **Sleep deprivation and neurobehavioral dynamics.** *Curr Opin Neurobiol* 2013. The latest installation of an annually updated overview of current sleep deprivation research.
4. Walker MP: **The role of sleep in cognition and emotion.** *Ann N Y Acad Sci* 2009, **1156**:168-197.
5. Lim J, Dinges DF: **A meta-analysis of the impact of short-term sleep deprivation on cognitive variables.** *Psychol Bull* 2010, **136**:375-389.
6. Rakitin BC, Tucker AM, Basner RC, Stern Y: **The effects of stimulus degradation after 48 hours of total sleep deprivation.** *Sleep* 2012, **35**:113-121.
7. Ong JL, Asplund CL, Chia TT, Chee MW: **Now you hear me, now you don't: eyelid closures as an indicator of auditory task disengagement.** *Sleep* 2013, **36**:1867-1874.
8. Doran SM, Van Dongen HP, Dinges DF: **Sustained attention performance during sleep deprivation: evidence of state instability.** *Arch Ital Biol* 2001, **139**:253-267.
9. Saper CB, Scammell TE, Lu J: **Hypothalamic regulation of sleep and circadian rhythms.** *Nature* 2005, **437**:1257-1263.
10. Kastner S, Ungerleider LG: **Mechanisms of visual attention in the human cortex.** *Annu Rev Neurosci* 2000, **23**:315-341.
11. Gauthier B, Eger E, Hesselmann G, Giraud AL, Kleinschmidt A: **Temporal tuning properties along the human ventral visual stream.** *J Neurosci* 2012, **32**:14433-14441.
12. McKeef TJ, Remus DA, Tong F: **Temporal limitations in object processing across the human ventral visual pathway.** *J Neurophysiol* 2007, **98**:382-393.
13. Kong D, Asplund CL, Chee MW: **Sleep deprivation reduces the rate of rapid picture processing.** *Neuroimage* 2014, **91**:169-176. The leftward shift in temporal response function in the PPA represents an interaction between state and presentation frequency in a region known to be a visual processing bottleneck (see preceding reference [12]).
14. Lim J, Tan JC, Parimal S, Dinges DF, Chee MWL: **Sleep deprivation impairs object-selective attention: a view from the ventral visual cortex.** *PLoS ONE* 2010, **5**:e9087.
15. Chee MWL, Tan JC, Parimal S, Zagorodnov V: **Sleep deprivation and its effects on object-selective attention.** *Neuroimage* 2010, **49**:1903-1910.
16. Langner R, Willmes K, Chatterjee A, Eickhoff SB, Sturm W: **Energetic effects of stimulus intensity on prolonged simple reaction-time performance.** *Psychol Res* 2010, **74**:499-512.
17. Chee MW, Goh CS, Namburi P, Parimal S, Seidl KN, Kastner S: **Effects of sleep deprivation on cortical activation during directed attention in the absence and presence of visual stimuli.** *Neuroimage* 2011, **58**:595-604.
18. Tomasi D, Wang RL, Telang F, Boronikolas V, Jayne MC, Wang G-J, Fowler JS, Volkow ND: **Impairment of attentional networks after 1 night of sleep deprivation.** *Cereb Cortex* 2009, **19**:233-240.
19. Poudel GR, Innes CRH, Jones RD: **Distinct neural correlates of time-on-task and transient errors during a visuomotor tracking task after sleep restriction.** *Neuroimage* 2013, **77**:105-113. One of a series of thoughtful investigations from this group concerning the neural correlates of fatigue covering time-on-task effects.
20. Lavie N: **Perceptual load as a necessary condition for selective attention.** *J Exp Psychol Hum Percept Perform* 1995, **21**:451-468.
21. Pessoa L, Padmala S, Morland T: **Fate of unattended fearful faces in the amygdala is determined by both attentional resources and cognitive modulation.** *Neuroimage* 2005, **28**:249-255.

22. Forster S, Lavie N: **High perceptual load makes everybody equal: eliminating individual differences in distractibility with load.** *Psychol Sci* 2007, **18**:377-381.
23. Rees G, Frith CD, Lavie N: **Modulating irrelevant motion perception by varying attentional load in an unrelated task.** *Science* 1997, **278**:1616-1619.
24. Yi D-J, Woodman GF, Widders D, Marois R, Chun MM: **Neural fate of ignored stimuli: dissociable effects of perceptual and working memory load.** *Nat Neurosci* 2004, **7**:992-996.
25. Kong D, Soon CS, Chee MW: **Reduced visual processing capacity in sleep-deprived persons.** *Neuroimage* 2011, **55**:629-634.
26. Clapp WC, Gazzaley A: **Distinct mechanisms for the impact of distraction and interruption on working memory in aging.** *Neurobiol Aging* 2012, **33**:134-148.
27. Gazzaley A, Cooney JW, McEvoy K, Knight RT, D'Esposito M: **Top-down enhancement and suppression of the magnitude and speed of neural activity.** *J Cogn Neurosci* 2005, **17**:507-517.
28. O'Craven KM, Downing PE, Kanwisher N: **fMRI evidence for objects as the units of attentional selection.** *Nature* 1999, **401**:584-587.
29. Kong D, Soon CS, Chee MW: **Functional imaging correlates of impaired distractor suppression following sleep deprivation.** *Neuroimage* 2012, **61**:50-55.
30. Lustig C, Hasher L, Zacks R: **Inhibitory deficit theory: Recent developments in a 'new view'.** In *The place of inhibition in cognition*. Edited by Gorfain D, MacLeod C. American Psychological Association; 2007:145-162.
31. Gazzaley A, Cooney J, Rissman J, D'Esposito M: **Top-down suppression deficit underlies working memory impairment in normal aging.** *Nat Neurosci* 2005, **8**:1298-1300.
32. Kim S, Hasher L, Zacks RT: **Aging and a benefit of distractibility.** *Psychon Bull Rev* 2007, **14**:301-305.
33. Drummond SPA, Anderson DE, Straus LD, Vogel EK, Perez VB: **The effects of two types of sleep deprivation on visual working memory capacity and filtering efficiency.** *PLoS ONE* 2012, **7**:e35653.
34. Anderson C, Horne JA: **Sleepiness enhances distraction during a monotonous task.** *Sleep* 2006, **29**:573-576.
35. Chun MM: **Visual working memory as visual attention sustained internally over time.** *Neuropsychologia* 2011, **49**:1407-1409.
36. Luck SJ, Vogel EK: **The capacity of visual working memory for features and conjunctions.** *Nature* 1997, **390**:279-281.
37. Chee MW, Chuah YM: **Functional neuroimaging and behavioral correlates of capacity decline in visual short-term memory after sleep deprivation.** *Proc Natl Acad Sci U S A* 2007, **104**:9487-9492.
38. Chuah LY, Chee MW: **Cholinergic augmentation modulates visual task performance in sleep-deprived young adults.** *J Neurosci* 2008, **28**:11369-11377.
39. Alvarez GA, Cavanagh P: **The capacity of visual short-term memory is set both by visual information load and by number of objects.** *Psychol Sci* 2004, **15**:106-111.
40. Wee N, Asplund CL, Chee MW: **Sleep deprivation accelerates delay-related loss of visual short-term memories without affecting precision.** *Sleep* 2013, **36**:849-856.
41. Tallon-Baudry C, Bertrand O, Fischer C: **Oscillatory synchrony between human extrastriate areas during visual short-term memory maintenance.** *J Neurosci* 2001, **21**:RC177.
42. D'Esposito M: **From cognitive to neural models of working memory.** *Philos Trans R Soc B: Biol Sci* 2007, **362**:761-772.
43. Vyazovskiy VV, Olcese U, Hanlon EC, Nir Y, Cirelli C, Tononi G: **Local sleep in awake rats.** *Nature* 2011, **472**:443-447.  
 Important empirical support for the local sleep hypothesis derived from invasive electrophysiological recordings. It connects the occurrence of 'off' periods in frontal and parietal cortex with behavioral lapses.
44. Pigarev IN, Nothdurft HC, Kastner S: **Evidence for asynchronous development of sleep in cortical areas.** *Neuroreport* 1997, **8**:2557-2560.
45. Warm JS, Parasuraman R, Matthews G: **Vigilance requires hard mental work and is stressful.** *Hum Factors* 2008, **50**:433-441.
46. Wilkinson RT: **Effects of up to 60 hours' sleep deprivation on different types of work.** *Ergonomics* 1964, **7**:175-186.
47. Van Dongen HPA, Belenky G, Krueger JM: **Investigating the temporal dynamics and underlying mechanisms of cognitive fatigue.** In *Cognitive Fatigue: Multidisciplinary perspectives on current research and future applications. Decade of Behavior/ Science Conference*. Edited by Ackerman PL. American Psychological Association; 2011:127-147.  
 Good review of time on task effects.
48. Chee MW, Tan JC: **Lapsing when sleep deprived: neural activation characteristics of resistant and vulnerable individuals.** *Neuroimage* 2010, **51**:835-843.
49. Lim J, Wu WC, Wang J, Detre JA, Dinges DF, Rao H: **Imaging brain fatigue from sustained mental workload: an ASL perfusion study of the time-on-task effect.** *Neuroimage* 2010, **49**:3426-3435.
50. Paus T, Zatorre RJ, Hofle N, Caramanos Z, Gotman J, Petrides M, Evans AC: **Time-related changes in neural systems underlying attention and arousal during the performance of an auditory vigilance task.** *J Cogn Neurosci* 1997, **9**:392-408.
51. Coull JT, Frackowiak RSJ, Frith CD: **Monitoring for target objects: activation of right frontal and parietal cortices with increasing time on task.** *Neuropsychologia* 1998, **36**:1325-1334.
52. Asplund CL, Chee MW: **Time-on-task and sleep deprivation effects are evidenced in overlapping brain areas.** *Neuroimage* 2013, **82**:326-335.  
 Used ASL to examine baseline CBF in the sleep deprived state. CBF and BOLD signal changes in response to task and time-on-task were also compared.
53. Krueger JM, Obál F: **A neuronal group theory of sleep function.** *J Sleep Res* 1993, **2**:63-69.
54. Hung C-S, Sarasso S, Ferrarelli F, Riedner B, Ghilardi MF, Cirelli C, Tononi G: **Local experience-dependent changes in the wake EEG after prolonged wakefulness.** *Sleep* 2013, **36**:59-72.  
 A study that shows task-specific increased slow wave activity in areas deliberately engaged in two different tasks.
55. Smit AS, Eling PATM, Coenen AML: **Mental effort causes vigilance decrease due to resource depletion.** *Acta Psychol (Amst)* 2004, **115**:35-42.
56. Mackworth JF: **Vigilance, arousal, and habituation.** *Psychol Rev* 1968, **75**:308-322.
57. Langner R, Steinborn MB, Chatterjee A, Sturm W, Willmes K: **Mental fatigue and temporal preparation in simple reaction-time performance.** *Acta Psychol* 2010, **133**:64-72.
58. De Havas JA, Parimal S, Soon CS, Chee MW: **Sleep deprivation reduces default mode network connectivity and anti-correlation during rest and task performance.** *Neuroimage* 2012, **59**:1745-1751.
59. Sämann PG, Tully C, Spormaker VI, Wetter TC, Holsboer F, Wehrle R, Czisch M: **Increased sleep pressure reduces resting state functional connectivity.** *Magma (New York, NY)* 2010, **23**:375-389.
60. Gujar N, Yoo SS, Hu P, Walker MP: **The unrested resting brain: sleep deprivation alters activity within the default-mode network.** *J Cogn Neurosci* 2010, **22**:1637-1648.
61. Drummond SP, Bischoff-Grethe A, Dinges DF, Ayalon L, Mednick SC, Meloy MJ: **The neural basis of the psychomotor vigilance task.** *Sleep* 2005, **28**:1059-1068.
62. Larson-Prior LJ, Power JD, Vincent JL, Nolan TS, Coalson RS, Zempel J, Snyder AZ, Schlaggar BL, Raichle ME, Petersen SE: **Modulation of the brain's functional network architecture in**

- the transition from wake to sleep.** *Prog Brain Res* 2011, **193**:277-294.
63. Bosch OG, Rihm JS, Scheidegger M, Landolt HP, Stampfli P, Brakowski J, Esposito F, Rasch B, Seifritz E: **Sleep deprivation increases dorsal nexus connectivity to the dorsolateral prefrontal cortex in humans.** *Proc Natl Acad Sci U S A* 2013, **110**:19597-19602.
  64. Samann PG, Wehrle R, Hoehn D, Spoormaker VI, Peters H, Tully C, Holsboer F, Czeisler M: **Development of the brain's default mode network from wakefulness to slow wave sleep.** *Cereb Cortex* 2011, **21**:2082-2093.
- Clear description the evolution of functional imaging changes that occur in the transition from wake to slow wave sleep (also see ref [62]).
65. Spoormaker VI, Schröter MS, Gleiser PM, Andrade KC, Dresler M, Wehrle R, Sämman PG, Czeisler M: **Development of a large-scale functional brain network during human non-rapid eye movement sleep.** *J Neurosci* 2010, **30**:11379-11387.
  66. Horovitz SG, Braun AR, Carr WS, Picchioni D, Balkin TJ, Fukunaga M, Duyn JH: **Decoupling of the brain's default mode network during deep sleep.** *Proc Natl Acad Sci U S A* 2009, **106**:11376-11381.
  67. Ward AM, McLaren DG, Schultz AP, Chhatwal J, Boot BP, Hedden T, Sperling RA: **Daytime sleepiness is associated with decreased default mode network connectivity in both young and cognitively intact elderly subjects.** *Sleep* 2013, **36**:1609-1615.
  68. Picchioni D, Pixa ML, Fukunaga M, Carr WS, Horovitz SG, Braun AR, Duyn JH: **Decreased connectivity between the thalamus and the neocortex during human nonrapid eye movement sleep.** *Sleep* 2014, **37**:387-397.
  69. Shao Y, Wang L, Ye E, Jin X, Ni W, Yang Y, Wen B, Hu D, Yang Z: **Decreased thalamocortical functional connectivity after 36 hours of total sleep deprivation: evidence from resting state FMRI.** *PLoS ONE* 2013:e78830.
  70. Liu H, Li H, Wang Y, Lei X: **Enhanced brain small-worldness after sleep deprivation: a compensatory effect.** *J Sleep Res* 2014.
  71. Tagliazucchi E, Laufs H: **Decoding wakefulness levels from typical fMRI resting-state data reveals reliable drifts between wakefulness and sleep.** *Neuron* 2014, **82**:695-708.
- A sophisticated retrospective analysis of resting state data found that a third of resting state studies in 'awake' participants contain features suggestive of sleep. This is an important consideration when interpreting results of such studies.
72. Chuah LY, Chong DL, Chen AK, Rekshan WR III, Tan JC, Zheng H, Chee MW: **Donepezil improves episodic memory in young individuals vulnerable to the effects of sleep deprivation.** *Sleep* 2009, **32**:999-1000.
  73. Luber B, Steffener J, Tucker A, Habeck C, Peterchev AV, Deng Z-D, Basner RC, Stern Y, Lisanby SH: **Extended remediation of sleep deprived-induced working memory deficits using fMRI-guided transcranial magnetic stimulation.** *Sleep* 2013, **36**:857-871.
- The authors replicate a previous study showing the benefits of TMS on working memory in sleep deprived persons and suggest it to be a non-pharmacological intervention meriting further study.
74. Krueger JM, Rector DM, Roy S, Van Dongen HP, Belenky G, Panksepp J: **Sleep as a fundamental property of neuronal assemblies.** *Nat Rev Neurosci* 2008, **9**:910-919.
  75. Brown RE, Basheer R, McKenna JT, Strecker RE, McCarley RW: **Control of sleep and wakefulness.** *Physiol Rev* 2012, **92**:1087-1187.
  76. Hutchison RM, Womelsdorf T, Allen EA, Bandettini PA, Calhoun VD, Corbetta M, Della Penna S, Duyn JH, Glover GH, Gonzalez-Castillo J *et al.*: **Dynamic functional connectivity: promise, issues, and interpretations.** *Neuroimage* 2013, **80**:360-378.
- A superb review of an emerging approach to evaluating large-scale neural dynamics that has application in the study of wakefulness, drowsiness and sleep.