

https://doi.org/10.1093/sleepadvances/zpaf020 Advance access publication 26 March 2025 Research Methods, Protocols, Procedures

# Research Methods, Protocols, Procedures

# Protocol for a pilot hybrid type I effectivenessimplementation study to improve help-seeking for sleep disorders in the future healthcare workforce: The Sleep Check Before Shift Work trial

Claire Dunbar<sup>1</sup>, Kelly Sansom<sup>1,2</sup>, Nicole Lovato<sup>1</sup>, Andrew Vakulin<sup>1</sup>, Kelly A. Loffler<sup>3</sup>, Katrina Nguyen<sup>1</sup>, Josh Fitton<sup>1</sup>, Shantha M.W. Rajaratnam<sup>4</sup>, Tracey L. Sletten<sup>4</sup>, Gorica Micic<sup>1</sup>, Sally A. Ferguson<sup>5</sup>, Sian E. Wanstall<sup>1</sup>, Brandon W.J. Brown<sup>1</sup>, Gillian Harvey<sup>6</sup>, Robert Adams<sup>1</sup> and Amy C. Reynolds<sup>1,\*</sup>

#### Abstract

Sleep disorders are prevalent in shift workers but are commonly undiagnosed and unmanaged. This poses considerable safety, productivity, and health risks. There is limited education or early intervention to encourage awareness of, and treatment for, sleep disorders in young adults who will transition into careers requiring shift work. This study aims to investigate (a) the clinical effectiveness of simulated shift work exposure and cognitive performance feedback for prompting help-seeking for sleep problems, and (b) the feasibility and acceptability of implementing this intervention for future healthcare workers. A hybrid type I effectiveness-implementation trial will be conducted from June 2024 to December 2025 with prospective healthcare workers currently enrolled in a medicine, paramedicine, or nursing degree. Ninety adults (18–39 years) who self-report sleep disturbances will be recruited and complete a combination of structured clinical interviews, screening questionnaires, remote monitoring technology, and overnight polysomnography (PSG). Participants will be randomized across three conditions, with varying exposure to a simulated transition to night shift without sleep, and cognitive performance feedback. All individuals will attend a diagnostic appointment with a sleep psychologist or sleep physician and discuss help-seeking pathways for their sleep. The primary outcomes will be help-seeking from a health professional for sleep (yes/no), time to help-seeking (days), and road safety-related events over 12 months. Process evaluation will explore the feasibility and acceptability of this approach from the participants' perspective.

Key words: shift work; performance; sleep disorder; implementation; translation; healthcare; occupational health; safety

#### Statement of Significance

Young adults with sleep disorders are poorly screened and managed. This is particularly problematic in the context of further disruption to their sleep opportunities due to shift work requirements. This effectiveness-implementation trial is the first to consider supported care pathways for help-seeking to improve sleep before making the transition to regular shift work in the healthcare industry, with a focus on improving road safety and mental health outcomes.

Shift work is a common working arrangement in Australia, broadly defined as schedules which fall outside the traditional 0800–1800 hours. This can include fixed schedules (morning,

afternoon, or night shift), casual or variable rosters, and rotating rosters [1]. Extended periods of wakefulness, and working at times of day when the body is biologically primed for sleep, are both

<sup>&</sup>lt;sup>1</sup>Flinders Health and Medical Research Institute: Sleep Health, Flinders University, Adelaide, SA, Australia,

<sup>&</sup>lt;sup>2</sup>Centre for Healthy Ageing, Health Futures Institute, Murdoch University, Perth, WA, Australia,

<sup>&</sup>lt;sup>3</sup>Flinders Clinical Trials, Flinders University, Adelaide, SA, Australia,

School of Psychological Sciences and Turner Institute for Brain and Mental Health, Monash University, Melbourne, VIC, Australia,

<sup>&</sup>lt;sup>5</sup>Appleton Institute, CQUniversity, Adelaide, SA, Australia and

<sup>&</sup>lt;sup>6</sup>Caring Futures Institute, College of Nursing and Health Sciences, Flinders University, Adelaide, SA, Australia

<sup>&#</sup>x27;Corresponding author. Amy C. Reynolds, Flinders University, Mark Oliphant Building, Flinders Health and Medical Research Institute: Sleep Health, 5 Laffer Drive, Bedford Park, South Australia 5042. Email: amy.reynolds@flinders.edu.au.

synonymous with shift work. Consequently, shift workers are vulnerable to workplace and road safety incidents. This vulnerability can be a function of extended wake periods and insufficient sleep, both of which are common for shift workers. This is particularly concerning for workers who need to drive at night either as part of their job or to commute to and from the workplace.

Shift workers are also vulnerable to common sleep disorders. Prevalence rates for common sleep disorders (obstructive sleep apnea [OSA], insomnia, restless legs syndrome) severe enough to warrant clinical investigation and management range from 20% in early adulthood [2] through to 43% by middle age [3] in the broader population. These rates are thought to be similar [4] or higher [5, 6] in shift workers. Both sleep disorders and shift work conditions are independently associated with performance decrements, including neurocognitive impairment [7-9], impaired driving performance [10-13], and higher rates of near misses and actual road safety events [14-16]. Studies on the combined effects of both shift work and sleep disorders suggest a cumulative negative effect of night shift work and a sleep disorder for mental health [4], and prospective associations with falling asleep at the wheel [17].

High rates of both shift work conditions and sleep disorders in emerging adults mean shift work and sleep disorders commonly co-occur; yet population estimates suggest that >80% of young adults with sleep disorders are undiagnosed [4], likely indicative of low help-seeking rates. Even when provided with cost-free specialist treatment options, active help-seeking for a sleep disorder is limited in emerging and early adulthood [18]. This aligns with broader evidence that shift workers with sleep disorder symptoms do not actively seek help for their sleep complaints [19, 20], often attributing their symptoms to shift work schedules alone. Consequently, shift workers can report long times to seek help, and pathways to diagnosis that are not straightforward [19]. Collectively, these issues represent a significant barrier to timely and effective care, exposing shift workers to additional health and safety risks associated with unmanaged sleep disorders.

With ~25% of employed emerging adults identifying as shift workers, 20% of whom meet the criteria for a sleep disorder in Australia [4], there is a demonstrable need for intervention strategies that promote early and rapid help-seeking for sleep disorders. This should be a priority for improving road safety [21, 22], productivity [23], and mental health [4] outcomes observed in emerging and early adulthood. This manuscript outlines the protocol for a hybrid type I effectiveness-implementation randomized controlled trial (RCT). The trial will assess both the clinical effectiveness and implementation of a multi-component night shift simulation intervention aimed at increasing help-seeking behavior for sleep disorders in emerging and early adulthood, specifically in those who are training to enter healthcare professions with shift work requirements.

#### Aims and objectives

In a cohort of healthcare students with a high likelihood of future shift work requirements, the Sleep Check before Shift Work trial aims to:

(1) assess the effectiveness of a brief sleep disorder education module combined with an in-laboratory sleep study and shift work simulation experience (+/- personalized performance feedback) for improving help-seeking behavior for sleep problems,

- (2) determine whether engaging with diagnosis and treatment for sleep disorders improves self-reported road safety events, and
- (3) conduct a process evaluation to understand the feasibility and acceptability of the intervention, including facilitators and barriers to implementation from the participant's perspective.

#### Methods

This protocol was designed and reported in accordance with The Standard Protocol Items: Recommendations for Intervention Trials (SPIRIT) statement [24] (Supplementary Table 1). Ethical approval was granted for this protocol (Version 1.0) by Flinders University's Human Research Ethics Committee (6548) in January 2024 and the trial is registered with the Australian New Zealand Clinical Trials Registry (ACTRN12624000339550). Translation of findings will be through funder-supported fora, scientific meetings, tertiary education (guest lectures, University events), peer-reviewed publications, and broader healthcare industry events.

# Study design

Sleep check before shift work is a hybrid type-I effectivenessimplementation study [25], comprising a three-arm, RCT. The study protocol is visualized in Figure 1. Participants will be randomized into one of three groups: a control group undergoing only diagnostic polysomnography (PSG; Arm 1); a group undergoing PSG and a simulated night shift (Arm 2); and a third group undergoing PSG, simulated night shift and additional personalized cognitive feedback (Arm 3). The aim of the study is to identify the most effective strategy for encouraging help-seeking behavior for sleep disorders in future healthcare workers. An integrated process evaluation using the Health Belief Model will be conducted; both qualitative interviews and quantitative measures of acceptability, appropriateness, and feasibility are included to understand barriers and facilitators to implementation. Ethical approval was obtained from the Human Research Ethics Committee at Flinders University (project number: 6548) in January 2024. Modifications to the protocol will be communicated to the research team at monthly reporting, immediately updated with local ethics committees, amended in the trial registration documents, and communicated to impacted parties (e.g. participants, journals) as appropriate. No formal data monitoring committee was established for this trial due to its short duration and known minimal risks. Data quality checks will be performed at the conclusion of every laboratory visit. As a single-site implementation trial, a formal auditing procedure is not provided.

#### The health belief model

This trial design, and the process evaluation, are informed by the Health Belief Model [26]. The Health Belief Model proposes that engagement in health behaviors is influenced by individual perceptions about the severity of a health condition (or disease), their own susceptibility, and any perceived benefits or barriers to engaging in health behavior to address the health condition (or disease) [26]. In the context of this study, for an individual to engage in health behavior (help-seeking) related to a health condition (sleep problems), the perceived threat of the sleep problem and potential benefits of help-seeking would need to be greater than the perceived and/or actual barriers to help-seeking (including

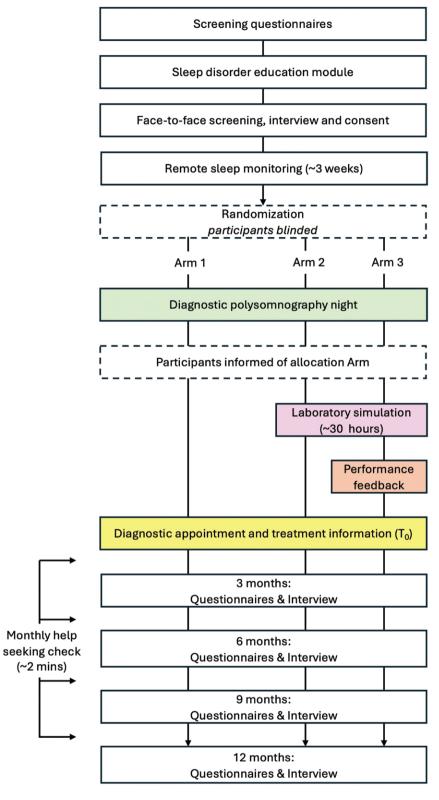


Figure 1. Flow diagram showing participant screening, recruitment, randomization, and intervention arms.

known cost, time demands, and challenges with health system navigation from pilot work) [18]. The trial is designed to provide personalized information to increase awareness of susceptibility and severity, by providing diagnostic information and varying degrees of exposure and feedback on performance related to sleep (see Intervention below). Cues to action are supported through a personalized sleep feedback appointment, coupled with information for the participant and their general practitioner (should they choose to share with their GP), about the primary sleep complaint and findings from the trial. Participants are also provided with the option of gap-free treatment for 12 months post-intervention if they choose, to address previous barriers identified with regards

to cost and access [18]. This is not compulsory for participation in the trial, and it is at the participants' discretion if they choose to access care with their own provider, or through a gap-free option at the AISH Sleep Health Clinic. This trial proposes that addressing aspects of the Health Belief Model can increase the likelihood of help-seeking behavior in a cohort of future healthcare workers. Targeting facets of the Health Belief Model have contributed to successful behavior change across a diverse range of health conditions including colorectal cancer [27], osteoporosis [28], vaccination uptake [29], and increasing levels of physical activity in healthy adults [30].

### Setting

The diagnostic sleep studies and simulated night shift will be undertaken at the Nick Antic Sleep Laboratory (Flinders Health and Medical Research Institute: Sleep Health [FHMRI:Sleep Health]), a six-bedroom human sleep laboratory located at Flinders University in Adelaide, South Australia. The trial will be overseen by a qualified sleep physician, as well as registered and provisional psychologists within the co-located AISH Sleep Health Clinics. Adherence to the in-laboratory intervention will be ensured with continuous research team monitoring for the duration of a participant's stay in the sleep laboratory.

# **Participants**

We will recruit 90 emerging and early adults aged 18–39 years with undergraduate healthcare degrees. These degree qualifications are selected due to their high likelihood of future shift work requirements (medicine, paramedicine, and nursing). Emerging (18–25 years) [31] and early (~25–40 years) adulthood is the target participant group. Participants will be recruited via

electronic communications (email and course home pages), or by advertisements posted on websites and media outlets. Potential participants will initially view a brief (~15 minutes) educational video about sleep disorders in early adulthood, delivered by an early career health professional in their relevant field and a video tailored to their degree sequence. This video was designed in response to feedback from early career healthcare workers that there is insufficient education about sleep disorders for future shift workers during tertiary education, and that education needs to be provided with input from peers and professionals [32]. The videos were designed specifically for this project, with content delivered by an Australian Health Practitioner Regulation Agency registered paramedic, nurse and sleep physician, and paired with lived experience content. Potential participants will have the opportunity to express interest in the trial upon completion of the educational video.

Inclusion and exclusion criteria are summarized in Table 1.

#### **Procedure**

# Screening

A series of validated sleep questionnaires will be used initially to identify risk for a sleep disorder, and are summarized in Table 2.

#### Enrollment and consent

Potential participants will be screened for eligibility using an online questionnaire administered via the secure online Research Electronic Data Capture (REDCap) database. Consent for the online screening will be provided electronically. Individuals with an indication of a possible sleep disorder according to screening

Table 1. Trial Inclusion and Exclusion Criteria

#### Inclusion criteria

- Aged 18 and 39 years (inclusive)
- Currently enrolled in tertiary-level study in medicine, paramedicine, or nursing.
- Meet threshold criteria for one or more validated sleep disorder screening questionnaires:
  - Insomnia Severity Index (ISI) score ≥8
  - Epworth Sleepiness Scale (ESS) score >10
  - Screen as highly likely to have obstructive sleep apnea (OSA) on the Berlin questionnaire, and/or
  - Screen as highly likely to have restless legs syndrome (RLS) according to IRLSSG criteria
- Report a sleep difficulty in a structured clinical interview with a sleep physician or psychologist, consistent with an ICSD-3-TR or DSM-V-TR sleep disorder

#### Exclusion criteria

- Use of any illicit drugs or cannabis in the previous 4 weeks, or having drug dependencies that would mean they could not abstain for the duration of the extended wakefulness protocol.
- Unmanaged current suicidal ideation or intent.
- A history of traumatic brain injury, stroke, or neurodegenerative disorders (e.g. Parkinson's disease, Dementia).
- Smoking dependence (non-casual smoking) which would prevent them from remaining in the laboratory to complete the study.
- Pregnant, lactating, or caring for a newborn (under 12 months of age).
- Undertaking shift work between the hours of midnight and 05:00 am in the three days prior to their scheduled laboratory stay.

ICSD-3-TR, International Classification of Sleep Disorders Third Edition, text revision; DSM-V-TR, Diagnostic and Statistical Manual of Mental Disorders, Fifth Edition, text revision; IRLSSG, International Restless Legs Syndrome Study Group.

Table 2. Validated Sleep Questionnaires Used in Sleep Check Before Shift Work

# Questionnaire Screening purpose Epworth Sleepiness Scale [33] • Identifying excessive sleepiness (score > 10) Berlin Questionnaire [34] • Identify the risk of possible sleep apnea Insomnia Severity Index [35] • Determine the presence, and severity, of insomnia symptoms (score ≥8) Pittsburgh Sleep Quality Index [36] • Self-reported poor sleep quality (score ≥5) • Self-reported habitual bed and wake time • Self-reported habitual sleep duration IRLSSG\* restless legs symptoms criteria [37] • Identify the risk of restless legs syndrome

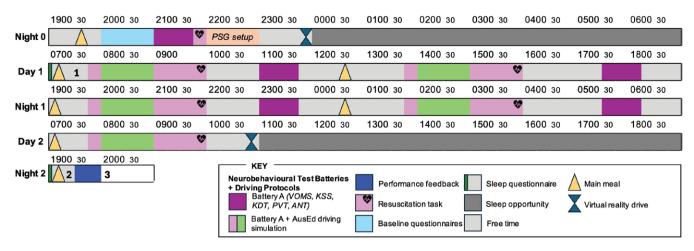


Figure 2. Conceptual example of the simulated transition to shift work protocol for a participant with 00:00 hours habitual bedtime, and 07:00 hours wake time. Protocol timing will be individualized to the participant's habitual bed and wake time to reflect the transition to the night shift relative to habitual sleep time. Numbers (1,2,3) correspond to the point at which participants conclude the protocol according to study Arm. Clock times reflect 12-hour spans across the days and nights studied. PSG, polysomnography; VOMS, vestibular-ocular motor reflexes; KSS, Karolinska sleepiness scale; KDT, Karolinska drowsiness test; PVT, psychomotor vigilance task; ANT, attention network test.

questionnaires (Table 2) will be invited to an in-person laboratory appointment, where trained research personnel will conduct a 2-hour screening and eligibility appointment.

Participants will complete a modified Structured Clinical Interview for Sleep Disorders (SCISD-R) [38] with a psychologist (registered and/or provisional), to confirm eligibility prior to randomization. This semi-structured interview covers key DSM-V-TR sleep disorders including chronic insomnia disorder, hypersomnolence disorder, circadian rhythm sleep-wake disorders, OSA, hypopnea disorder, restless legs syndrome, nightmare disorder, non-rapid eye movement (REM) sleep arousal disorders, REM sleep behavior disorder, and narcolepsy. Additional consideration of ICSD-3-TR sleep disorders according to screeners and clinical interview findings are included in the interview to screen for possible behaviorally induced insufficient sleep syndrome and sleep paralysis which are not explicitly recognized in the SCISD-R.

The SCISD-R results will be reviewed by the overseeing sleep medicine physician and/or sleep psychologist as appropriate to symptom presentation during the interview, with participants eligible if there is a high index of suspicion for a sleep disorder, subject to polysomnography or confirmation with clinical staff (according to individual sleep disorder diagnostic criteria). Participants will be provided with a tour of the sleep laboratory facilities and given the opportunity to trial tasks they would undertake on the simulated night shift protocol.

Formal informed written consent to participate in the trial will be obtained, after which participants will be randomized. Participants will be booked in for their overnight sleep study (+ simulated night shift) allowing for ~2 to 3-week sleep tracking period. They will be provided with a Withings Sleep Analyzer [39] for pre-study monitoring of habitual bed and wake times at home, and risk for OSA based on the apnea-hypopnea index. This technology has been used previously to explore sleep-wake timings [40], sleep duration [41], and variability in OSA severity over time [42].

Participants will be randomized to a trial arm once their attendance is confirmed, using 1:1:1 block randomization [43], stratified by sex and healthcare degree sequence. The randomization sequence will be generated by an independent academic (KL) who is not directly involved in either recruitment or data

collection, and allocation will be blinded to participant-facing personnel and potential participants prior to consent. The randomization will occur within an embedded module in REDCap, and data will be collected and stored securely in the platform for the intervention and follow-up period. Participants will be blinded to their condition prior to attendance at the sleep laboratory for their overnight study, with the instruction to participants being to plan for attendance for the duration of the laboratory protocol. Unblinding will only be permissible if there are circumstances related to inclusion criteria and attendance, and only under the instruction of the chief investigator.

# Intervention

Up to six participants will be booked at a time for the laboratory protocol. All participants will be made aware that there are multiple arms to the trial, and that length of stay in the laboratory will differ by arm allocation. Consequently, participants will be asked to plan for admission to the laboratory for the full duration of the study. Allocation to the condition will not be revealed to participants until after the diagnostic night. Participants will be admitted to the laboratory in the evening ~5 hours prior to their habitual bedtime according to their pre-laboratory sleep diaries and under-mattress sleep data, with a subsequent sleep opportunity aligned to their habitual timing. A conceptual summary of the laboratory protocol for an individual with an 0000 hours habitual bedtime and sleep opportunity of seven hours is provided in Figure 2.

All participants will undergo diagnostic PSG on night one, to measure sleep timing and architecture as well as breathing, respiratory, and muscle activity metrics critical to the diagnosis of certain sleep disorders. Electroencephalography will be measured in the frontal (F3, F4, Fz), parietal (C3, C4, Cz), and occipital (O1, O2, and Oz) areas of the brain according to the international 10–20 electrode placement system [44, 45]. Standard electromyography (EMG), electrocardiography (ECG), and electro-oculography (EOG) will be assessed, as well as respiratory (abdominal and thoracic effort), airflow, snoring, and pulse oximetry [46]. Studies will then be independently scored according to the American Academy of Sleep Medicine 2017 guidelines [47]. While not a requirement for all sleep disorder diagnoses in the trial, this approach is included

to standardize the experience for all participants and ensure diagnoses of OSA are accurate, particularly as common screening instruments are insufficiently sensitive and specific to rule out OSA [48]. Events (i.e. nausea from simulator tasks, health outcomes, headaches, and fatigue) will be recorded in individual minute-by-minute protocols for the laboratory stay, and recorded in the secure REDCap database.

# Arm 1 (diagnostic polysomnography only)

Participants randomized to Arm 1 will be invited to complete overnight polysomnography and will be advised the following morning that they are able to leave the laboratory after completing a morning sleep questionnaire about their overnight sleep opportunity and eating breakfast.

# Arm 2 (diagnostic polysomnography + simulated transition to shift)

Participants randomized to Arms 2 and 3 will complete overnight PSG, as per Arm 1, and additionally experience a simulated transition to the night shift immediately thereafter (Figure 2). This will comprise ~28 hours of sustained wakefulness on performance tests (and a total of ~30 hours including final meals and PSG set-up), intentionally designed to simulate transitioning from day to night shift without an opportunity to nap.

The simulated shift will comprise repetitive testing including the 10 minutes visual psychomotor vigilance task (PVT) as an indicator of sustained attention [49], the attention network test as a measure of conflict resolution, spatial orienting, and alerting [50], vestibular-ocular motor screening as an indicator of alertness [51, 52], and the AusEd driving task (Woolcock Institute for Medical Research, Sydney, Australia) to assess simulated indicators of drowsy driving in accordance with previous protocols [53]. The NASA Task Load Index (NASA-TLX) [54] and Karolinska Sleepiness Scale [55] will be measured throughout test batteries to assess perceived workload and situational sleepiness, given their established utility in a sleep deprivation context.

Participants will also be asked to undertake a ~5-minute basic life support resuscitation exercise using a Laerdal Resusci Anne QCPR (Cardiopulmonary Resuscitation) torso manikin to assess practical resuscitation abilities during the transition to the night shift. Performance on objectively recorded CPR sessions will be recorded for each exercise. Arm 2 will be provided a recovery sleep opportunity (up to 8 hours), before leaving the laboratory.

# Arm 3 (Arm 2 + personalized cognitive performance feedback)

Arm 3 will experience the same simulated transition to the night shift. Upon completion of the recovery sleep opportunity, participants in Arm 3 will meet with a member of the research team prior to departure to review a standardized performance report showing their performance on PVT, driving simulation, and resuscitation tasks both when rested (first test battery after waking from diagnostic sleep), and after the final test battery in the simulated transition to night shift (sleepy). Comparison of their results to published performance after alcohol, and after longer sleep deprivation, will be shown for PVT performance, and comparison to participants with healthy sleep opportunities who experienced the same driving and wakefulness protocol in our sleep laboratory will be shown for driving performance. The simulated night shift can induce fatigue and sleepiness, and individuals respond differently. Being unable to maintain wakefulness, and needing to cease the protocol, reflects the impact of the transition for an

individual. Consequently, for both Arms 2 and 3, a participant can remain in the trial once they have started the simulation, even if they need to cease the protocol early and sleep. For participants in Arm 3 who cease the protocol early, their performance data to the point of cessation will be compared to their baseline during feedback. Any adverse events related to the protocol will be recorded in minute-by-minute protocols, and in the central REDCap system.

# Clinical follow-up appointment

In the week following the completion of their laboratory visit, all participants will attend a ~30-minute sleep physician and/or sleep psychologist appointment either at the AISH Clinic (located at Flinders University), or via telehealth, subject to participant preference. During the appointments, participants' sleep difficulties and symptoms will be discussed and clinicians will explain gold standard, evidence-based options for treatment of any identified sleep disorder(s), including written information about relevant sleep disorder(s) from the Australian Sleep Health Foundation webpage. Participants will be provided with the choice of costfree treatment for their sleep disorder via referral to the AISH Sleep Health Clinic at Flinders University as part of the trial, or a letter explaining any trial findings related to their sleep for their General Practitioner if external treatment is preferred. It will be at the patient's discretion which treatment option/s (if any) they choose to engage with following this appointment, and participation in the trial is not contingent on help-seeking through the AISH Sleep Health Clinic.

# Follow-up contact

After completion of the in-person component, participants will receive a monthly REDCap link via a short message service to complete brief questions (~2 minutes) about their help-seeking behavior for sleep for 12 months. Participants will have the option to request contact for sleep treatment at these monthly check-ins should they choose. Participants will also be asked to complete comprehensive follow-up online questionnaires at 3, 6, 9, and 12 months electronically through the REDCap online questionnaire system, per Table 3 and Supplementary Table 2. Follow-up contacts will occur via short message service, phone calls, and email for data capture to adequately track time to help-seeking. At 3 months, interviews will consider the motivation for participation, explore help-seeking (or non-help-seeking) behavior according to the Health Belief Model, and ask participants in Arms 2 and 3 to reflect on whether the simulation and performance feedback informed their help-seeking behavior. At 6, 9, and 12 months, check-ins will also consider any new or sustained behavior related to sleep. All interviews will contribute to a Process Evaluation, in order to assess the effectiveness, acceptability, appropriateness, and feasibility of the interventions. This will be conducted by a member of the research team with qualitative methods experience either via phone call, online (Microsoft Teams), or in-person subject to participant preference. Interviews will be recorded and transcribed.

#### Participant compensation

Participants will receive compensation in recognition of the time required to participate in the laboratory component of the trial, and subsequent follow-up. Across all arms, participants will receive \$340 for participation in the in-laboratory study and clinical follow-up appointment. They will subsequently receive \$20 gift cards for 3-, 6-, and 9-month follow-ups, and \$100 for the final

Table 3. Primary Clinical Effectiveness and Implementation Outcomes for the Sleep Check Before Shift Work Trial

Outcome	Description and unit	Collection points across 12-month follow-up
Help-seeking for sleep disorders		
Sought help from a health care professional specifically for sleep	• Self-report of healthcare appointments (categorized as yes/no over the 12-month follow-up, proportion)	Monthly
Time to the appointment with a health professional specifically for sleep	Self-report of appointments with a health professional to discuss sleep (number of days post diagnostic appointment to first appointment)	Monthly
Road safety events		
Self-reported driving events in the follow-up period	<ul> <li>Self-reported instances of falling asleep at the wheel, near-miss incidents due to sleepiness, or an incident or crash due to sleepiness in the past month (categorized as yes/no)</li> <li>Self-reported indicators of sleepy or distracted driving [56] (total number endorsed per follow-up)</li> </ul>	Quarterly
Implementation outcomes (process ev	paluation)	
Acceptability of intervention design Appropriateness of intervention design Feasibility of intervention design	<ul> <li>Acceptability of intervention measure (AIM) score [57], continuous</li> <li>Intervention appropriateness measure (IAM) score [57], continuous</li> <li>Feasibility of intervention measure (FIM) score [57], continuous</li> <li>Semi-structured interviews with participants, qualitative</li> </ul>	Quarterly Quarterly Quarterly 3, 6, 9, and 12 mont

12-month follow-up, to compensate time required to participate in questionnaires and interviews.

#### **Outcomes**

Primary outcomes for clinical effectiveness and implementation of the trial are summarized in Table 3. Additional secondary outcomes will be collected over the course of the study relating to mental health, quality of life, and sleep symptoms, and are summarized in Supplementary Table 2. Quantitative and qualitative data collection approaches have been selected based on pilot feasibility work in a similar population to the proposed recruitment group, where high responsivity to mixed methods was observed in the population of interest [18]. As there are no RCTs to enhance help-seeking in young adults with sleep disorders to appropriately calculate sample size for RCTs, this work represents a critical step in piloting personalized feedback using a higher-cost in-laboratory design. This is essential to determine whether resource allocation to simulation and personalized reports is justified in larger trials, with a sample size sufficient to consider the breadth of sleep disorders across gender and healthcare degrees. This work will directly inform feasibility in larger samples and appropriate sample size targets for future large-scale RCTs in this population.

# Data analysis

The primary software used to conduct statistical analyses will be R Studio (RStudio Team 2018, Boston, MA) with R version 4.3.2 (R Core Teams 2021, Vienna, Austria). Data transformations will be performed as appropriate for meeting statistical assumptions. If appropriate, and in accordance with published recommendations, multiple imputation will be used to manage missing data

Using the intention to treat, binary logistic regression analysis will be used where the endpoint (help-seeking: yes/no) is compared by the trial arm. Time-to-event (survival) analysis will be conducted, with the event of interest being the number of days from the diagnostic interview (T<sub>o</sub>) to a participant's self-reported appointment with a healthcare provider to discuss sleep management. Cox proportional hazards models [59] will be utilized with time (days) to help-seeking behavior and trial arm allocation (condition). This approach allows for the inclusion of cases lost to follow-up, as well as consideration of time-varying covariates [60]. We will include stratification factors for randomization (sex and degree sequence) as factors in analyses.

The acceptability, appropriateness, and feasibility of the intervention approach will be analyzed both quantitatively [57] and qualitatively. In accordance with developer instructions, scales will be created for each of the measures respectively by averaging responses and using linear mixed-effects models to consider differences between trial arms, and any changes in perceived acceptability, appropriateness, and feasibility over follow-up [57]. Qualitative analysis of feasibility and acceptability will be facilitated through semi-structured interviews, using both an inductive and deductive approach. Process evaluation will involve deductive coding to explore the participant's experience with the intervention across components of the Health Belief Model (perceived susceptibility and severity, perceived barriers or costs, perceived benefits, cues to action, and self-efficacy). We will explore similarities and differences between those who engage in help-seeking behavior, and consider these in the context of modifying factors including baseline demographic and psychological characteristics [61] to understand influences on implementation.

Subject to meeting assumptions for analysis, a combination of negative binomial logistic regression and mixed effects models will be used to examine the relationship between the intervention arm and driving events (categorized as Y/N), or indicators of fatigued driving (number and frequency of indicators endorsed) at quarterly follow-ups, allowing for within- and between-group comparisons of driving-related events. Appropriate adjustment for multiple comparisons will be incorporated in reporting, and exploratory analyses beyond the primary and secondary endpoints will be labeled accordingly.

Participant-level data will not be available for public access due to the confidential nature of clinical data and the potential for individual identification with less prevalent sleep disorder presentations. Access may be requested through the corresponding

author (ACR) and provided subject to consultation and consent from the local ethics office. Access to statistical code can be made available by the authorship teams with the publication, and the primary outcome paper will be publicly available through open-access publication.

## Discussion

Undiagnosed sleep disorders pose a considerable risk to health and safety, and emerging evidence suggests that in shift workers, these can go undiagnosed for extended periods of time. Previous feasibility work suggests that supporting early and emerging adults to access cost-free sleep disorder management is not sufficient alone to prompt help-seeking. Time constraints, financial constraints, and pathways to access mental health care plans needed for accessing government rebatable sleep services are limiting factors [18]. Consequently, feasibility work in young adults suggests that managing a known sleep disorder is not a priority, despite presenting as symptomatic [18]. Yet, there are known productivity, health, and safety (road and workplace) consequences of unmanaged sleep disorders, in some cases with greater negative impacts for shift workers with sleep disorders [4, 17, 62]. This trial will inform the level of personal exposure and performance feedback future shift workers may require to encourage help-seeking for sleep problems and begin an important co-design process for determining implementation pathways should the trial be successful.

This trial should be considered in light of some strengths and limitations from the outset. A key strength is the inclusion of a gap-free treatment option on-site at the AISH Sleep Health Clinic, in response to feasibility work which suggests that this is an obstacle to care. This will be optional, and at the participant's discretion, and trial participation will not be dependent on a choice to engage with the clinic if they prefer to use their own primary care provider. The trial is potentially vulnerable, as with many clinical effectiveness trials, to self-selection bias, whereby participants who volunteer to participate may be more likely to have an interest or motivation to access care. This will be considered during semi-structured interviews in order to transparently reflect the motivations for participation and potential impacts for generalizability.

Sleep check before shift work addresses an unmet need by considering proactive education and introducing early intervention opportunities before the added burden of shift work is experienced by our healthcare workforce. This study is the first to implement a program designed to increase early help-seeking in the real-world setting for prospective shift workers and provide essential insight into implementation needs to support this vulnerable workforce. If effective, this intervention has the potential to improve health and safety outcomes for individuals and reduce the productivity burden in workplaces attributable to sleep disorders in young adults. Importantly, the hybrid implementation-effectiveness design will provide a strong foundation for advocating for policy change to improve access to sleep services which meet the needs of emerging and early adulthood. This has the potential for broader implications related to improving the well-being of the healthcare workforce and improving visibility and awareness of the benefits associated with managing sleep disorders.

#### Dissemination

Findings from the trial will be disseminated in peer-reviewed scientific manuscripts, through academic and industry conferences, and via broader public opportunities provided by the funder (Lifetime Support Authority). State and national healthcare providers will be approached to share information which can be integrated into local education for sleep management for healthcare providers through our existing networks. Upon completion of the trial, we will also share trial findings with participants, and broader industry networks impacted by shift work. Authorship of publications will be in accordance with CrediT (Contributor Roles Taxonomy) criteria, and subject to input for design, conduct, analysis, and reporting of findings.

# Supplementary material

Supplementary material is available at SLEEP Advances online.

# **Funding**

This work was funded by the Lifetime Support Authority, a South Australian Government competitive grant scheme. The funder has no involvement in study design, data collection, data management, analysis, interpretation of data, writing or reports and manuscripts, and decisions to publish findings. Ethical approval date: January 2024. This project is funded by the Lifetime Support Authority, under a competitive grant scheme (CIA Reynolds). Trial Sponsor: Flinders University, Registry Road, Bedford Park SA 5039.

#### **Author Contribution**

Claire Dunbar (Data curation [supporting], Project administration [equal], Writing - original draft [equal], Writing - review & editing [equal]), Kelly Sansom (Funding acquisition [supporting], Project administration [supporting], Writing - original draft [supporting], Writing - review & editing [supporting]), Nicole Lovato (Methodology [supporting], Project administration [supporting], Supervision [supporting], Writing - review & editing [supporting]), Andrew Vakulin (Data curation [supporting], Funding acquisition [supporting], Methodology [supporting], Resources [supporting], Software [supporting], Writing - review & editing [supporting]), Kelly Loffler (Formal analysis [supporting], Methodology [supporting], Project administration [supporting], Software [supporting], Writing - review & editing [supporting]), Katrina Nguyen (Data curation [supporting], Project administration [supporting], Writing - review & editing [supporting]), Josh Fitton (Data curation [supporting], Project administration [supporting], Writing - review & editing [supporting]), Tracey Sletten (Funding acquisition [supporting], Methodology [supporting], Resources [supporting], Writing - review & editing [supporting]), Shantha Rajaratnam (Funding acquisition [supporting], Methodology [supporting], Writing - review & editing [supporting]), Sian E Wanstall (Funding acquisition [supporting], Methodology [supporting], Resources [supporting], Writing - review & editing [supporting]), Brandon Brown (Funding acquisition [supporting], Methodology [Supporting], Resources [supporting], Writing - review & editing [supporting]), Gillian Harvey (Methodology [supporting], Resources [supporting], Supervision [supporting], Writing - review & editing [supporting]), Amy Reynolds (Conceptualization [lead], Data curation [lead], Formal analysis [lead], Funding acquisition [lead], Investigation [lead], Methodology [lead], Project administration [equal], Supervision [equal], Writing - original draft [equal], Writing - review & editing [equal]), Gorica Micic (Project administration [supporting], Supervision [supporting], Writing - review & editing [supporting]), Sally Ferguson (Funding acquisition [supporting], Writing - review & editing [supporting]), and Robert Adams (Conceptualization [equal], Funding acquisition [supporting], Methodology [equal], Project administration [supporting], Supervision [equal], Writing - review & editing [equal])

#### **Disclosure Statement**

Financial disclosure: ACR declares funding from the National Health and Medical Research Council (NHMRC) Australia, Australian Research Council (ARC), Medical Research Future Fund (MRFF), Flinders Foundation, Hospital Research Foundation, and speaker fees from the Sleep Health Foundation for work unrelated to this study. NL reports funding from the NHMRC, ARC, MRFF, ReTime, and Hospital Research Foundation. AV's research is supported by the NHMRC and he has received competitive research funding and equipment from ResMed, Philips Respironics, and Withings for research unrelated to and outside the submitted work. RJA declares research funding from NHMRC, MRFF, Flinders Foundation, Hospital Research Foundation, ResMed Foundation, and Transport (Australian Government) outside the submitted work. KL reports grant funding from: the MRFF, the American Academy of Sleep Medicine, and Flinders Foundation; and contract research funding from Addend AI, unrelated to this project. JF receives doctoral scholarship funding from HOAP/Lumin Sports (Adelaide, South Australia). TLS has been supported by grants from Qantas Airways Ltd, through her institution, and she receives institutional consulting fees from Vanda Pharmaceuticals, outside of the submitted work. SMWR reports receiving grants and personal fees from Cooperative Research Centre for Alertness, Safety, and Productivity, receiving grants and institutional consultancy fees from Teva Pharma Australia and institutional consultancy fees from Vanda Pharmaceuticals, Circadian Therapeutics, BHP Billiton, and Herbert Smith Freehills; none of these disclosures are related to the current study. No other financial disclosures are provided. Nonfinancial disclosure: ACR is a national spokesperson for the Sleep Health Foundation. SMWR and RJA were board members of the Australian Sleep Health Foundation at the time of article submission. TLS has an unpaid appointment with the Sleep Health Foundation and received an honorarium for work with the National Sleep Foundation. No other nonfinancial disclosures are provided.

# **Data Availability**

Access to trial data will be at the discretion of the chief investigator (ACR), subject to the granted ethical approvals for the trial. Model consent form and other related documentation given to participants can be requested from the corresponding author.

#### References

- 1. Kecklund G, Axelsson J. Health consequences of shift work and insufficient sleep. BMJ. 2016;355:i5210. doi:10.1136/bmj.i5210
- 2. McArdle N, Ward SV, Bucks RS, et al. The prevalence of common sleep disorders in young adults: a descriptive population-based study. Sleep. 2020;43(10). doi:10.1093/sleep/zsaa072
- 3. McArdle N, Reynolds AC, Hillman D, et al. Prevalence of common sleep disorders in a middle-aged community sample. J Clin Sleep Med. 2022;18(6):1503-1514. doi:10.5664/jcsm.9886
- Reynolds AC, Lechat B, Melaku YA, et al. Shift work, clinically significant sleep disorders and mental health in a

- representative, cross-sectional sample of young working adults. Sci Rep. 2022;12(1):1-8.
- Kerkhof GA. Shift work and sleep disorder comorbidity tend to go hand in hand. Chronobiol Int. 2018;35(2):219-228. doi:10.1080/ 07420528.2017.1392552
- 6. Boersma GJ, Mijnster T, Vantyghem P, et al. Shift work is associated with extensively disordered sleep, especially when working nights. Front Psychiatry. 2023;14:1233640. doi:10.3389/ fpsyt.2023.1233640
- Vlasak T, Dujlovic T, Barth A. Neurocognitive impairment in night and shift workers: a meta-analysis of observational studies. Occup Environ Med. 2022;79(6):365-372. doi:10.1136/ oemed-2021-107847
- Fortier-Brochu E, Beaulieu-Bonneau S, Ivers H, et al. Insomnia and daytime cognitive performance: a meta-analysis. Sleep Med Rev. 2012;**16**(1):83–94. doi:10.1016/j.smrv.2011.03.008
- Zhou J, Camacho M, Tang X, et al. A review of neurocognitive function and obstructive sleep apnea with or without daytime sleepiness. Sleep Med. 2016;23:99-108. doi:10.1016/j. sleep.2016.02.008
- 10. Léger D, Bayon V, Ohayon MM, et al. Insomnia and accidents: cross-sectional study (EQUINOX) on sleep-related home, work and car accidents in 5293 subjects with insomnia from 10 countries. J Sleep Res. 2014;23(2):143-152. doi:10.1111/jsr.12104
- 11. Lee ML, Howard ME, Horrey WJ, et al. High risk of near-crash driving events following night-shift work. Proc Natl Acad Sci U S A. 2016;**113**(1):176–181. doi:10.1073/pnas.1510383112
- 12. Vakulin A, Baulk SD, Catcheside PG, et al. Driving simulator performance remains impaired in patients with severe OSA after CPAP treatment. J Clin Sleep Med. 2011;7(3):246-253. doi:10.5664/ JCSM.1062
- 13. Vakulin A, Catcheside PG, Baulk SD, et al. Individual variability and predictors of driving simulator impairment in patients with obstructive sleep apnea. J Clin Sleep Med. 2014;10(6):647-655. doi:10.5664/jcsm.3792
- 14. Ellen RLB, Marshall SC, Palayew M, et al. Systematic review of motor vehicle crash risk in persons with sleep apnea. J Clin Sleep Med. 2006;2(2):193-200.
- 15. Luzzi V, Mazur M, Guaragna M, et al. Correlations of obstructive sleep apnea syndrome and daytime sleepiness with the risk of car accidents in adult working population: a systematic review and meta-analysis with a gender-based approach. J Clin Med Res. 2022;**11**(14):3971. doi:10.3390/jcm11143971
- 16. Liu SY, Perez MA, Lau N. The impact of sleep disorders on driving safety-findings from the Second Strategic Highway Research Program naturalistic driving study. Sleep. 2018;41(4). doi:10.1093/ sleep/zsy023
- 17. Rajaratnam SMW, Barger LK, Lockley SW, et al. Sleep disorders, health, and safety in police officers. JAMA. 2011;306(23):2567-2578. doi:10.1001/jama.2011.1851
- 18. Brown BWJ, Adams RJ, Wanstall S, et al. Introducing a sleep disorder screening and management strategy for workers with future shift work requirements: a feasibility and acceptability study. Sci Rep. 2024;14(1):19964. doi:10.1038/ s41598-024-69479-0
- 19. Reynolds AC, Loffler KA, Grivell N, et al. Diagnosis and management of sleep disorders in shift workers, with patient informed solutions to improve health services research and practice. Sleep Med. 2023;113:131-141. doi:10.1016/j.sleep.2023.11.027
- 20. Brown BWJ, Crowther ME, Appleton SL, et al. Shift work disorder and the prevalence of help seeking behaviors for sleep concerns in Australia: a descriptive study. Chronobiol Int. 2022;39(5):714-724. doi:10.1080/07420528.2022.2032125

- 21. Smith S, Armstrong K, Steinhardt D, et al. Early morning road crashes: the effects of age and gender. In: Anderson R, ed. Australian Road Safety Research, Policing and Education Conference; 2008:623-636.
- 22. Martiniuk ALC, Senserrick T, Lo S, et al. Sleep-deprived young drivers and the risk for crash: the DRIVE prospective cohort study. JAMA Pediatr. 2013;167(7):647-655. doi:10.1001/ jamapediatrics.2013.1429
- 23. Reynolds AC, Coenen P, Lechat B, et al. Insomnia and workplace productivity loss among young working adults: a prospective observational study of clinical sleep disorders in a community cohort. Med J Aust. 2023;219(3):107-112. doi:10.5694/mja2.52014
- 24. Butcher NJ, Monsour A, Mew EJ, et al. Guidelines for Reporting Outcomes in Trial Protocols: The SPIRIT-Outcomes 2022 2022;328(23):2345-2356. Extension. JAMA. jama.2022.21243
- 25. Curran GM, Bauer M, Mittman B, et al. Effectivenessimplementation hybrid designs: combining elements of clinical effectiveness and implementation research to enhance public health impact. Med Care. 2012;50(3):217-226. doi:10.1097/ MLR.0b013e3182408812
- 26. Rosenstock IM. Historical origins of the health belief model. Health Educ Monogr. 1974;**2**(4):328-335. doi:10.1177/109019817400200403
- 27. Lau J, Lim TZ, Jianlin Wong G, et al. The health belief model and colorectal cancer screening in the general population: a systematic review. Prev Med Rep. 2020;20(101223):101223. doi:10.1016/j. pmedr.2020.101223
- 28. Khani Jeihooni A, Hidarnia A, Kaveh MH, , et al. The effect of a prevention program based on health belief model on osteoporosis. J Res Health Sci. 2015;15(1):47-53.
- 29. Zambri F, Quattrini A, Perilli I, et al. Health Belief Model efficacy in explaining and predicting intention or uptake influenza vaccination during pregnancy. Ann Ist Super Sanita. 2022;58(4):285-292. doi:10.4415/ANN\_22\_04\_09
- 30. Khodaveisi M, Azizpour B, Jadidi A, et al. Education based on the health belief model to improve the level of physical activity. Phys Act Nutr. 2021;25(4):17–23. doi:10.20463/pan.2021.0022
- 31. Arnett JJ. Emerging adulthood. A theory of development from the late teens through the twenties. Am Psychol. 2000;55(5):469–480.
- 32. Wanstall S, Naweed A, Brown B, et al. "I Wish I Had Known..." Drawing on the Lived Experience of Shift Work, Sleep Loss, and Fatigue in Early Career Australian Paramedics to Inform Sleep Education and Support. Flinders Health and Medical Research Institute (Sleep Health); 2023.
- 33. Johns MWA. New method for measuring daytime sleepiness: the Epworth sleepiness scale. Sleep. 1991;14(6):540-545.
- 34. Netzer NC, Stoohs RA, Netzer CM, et al. Using the Berlin Questionnaire to identify patients at risk for the sleep apnea syndrome. Ann Intern Med. 1999;131(7):485-491. doi:10.7326/0003-4819-131-7-199910050-00002
- 35. Bastien CH, Vallières A, Morin CM. Validation of the Insomnia Severity Index as an outcome measure for insomnia research. Sleep Med. 2001;2(4):297-307. doi:10.1016/s1389-9457(00)00065-4
- 36. Buysse DJ, Reynolds CF 3rd, Monk TH, et al. The Pittsburgh Sleep Quality Index: a new instrument for psychiatric practice and research. Psychiatry Res. 1989;28(2):193-213. doi:10.1016/0165-1781(89)90047-4
- 37. Allen RP, Picchietti D, Hening WA, et al. Restless legs syndrome: diagnostic criteria, special considerations, and epidemiology. a report from the restless legs syndrome diagnosis and

- epidemiology workshop at the National Institutes of Health. Sleep Med. 2003;4(2):101-119. doi:10.1016/s1389-9457(03)00010-8
- 38. Pruiksma KE, Dietch JR, Wardle-Pinkston S, et al. User Manual for the Structured Clinical Interview for DSM-5 Sleep Disorders - Revised (SCISD-R).; 2020. https://insomnia.arizona.edu/SCISD
- 39. Edouard P, Campo D, Bartet P, et al. Validation of the Withings Sleep Analyzer, an under-the-mattress device for the detection of moderate-severe sleep apnea syndrome. J Clin Sleep Med. 2021;17(6):1217-1227. doi:10.5664/jcsm.9168
- Scott H, Lechat B, Guyett A, et al. sleep irregularity is associated with hypertension: findings from over 2 million nights with a large global population sample. Hypertension. 2023;80(5):1117-1126. doi:10.1161/HYPERTENSIONAHA.122.20513
- 41. Scott H, Naik G, Lechat B, et al. Are we getting enough sleep? Frequent irregular sleep found in an analysis of over 11 million nights of objective in-home sleep data. Sleep Health. 2024;10:91-97. doi:10.1016/j.sleh.2023.10.016. https://www.sciencedirect. com/science/article/pii/S235272182300253X
- 42. Lechat B, Naik G, Reynolds A, et al. Multi-night prevalence, variability, and diagnostic misclassification of obstructive sleep apnea. Am J Respir Crit Care Med. 2021;205:563-569. doi:10.1164/ rccm.202107-1761oc
- 43. Broglio K. Randomization in clinical trials: permuted blocks and stratification. JAMA. 2018;319(21):2223-2224. doi:10.1001/ jama.2018.6360
- 44. Sazgar M, Young MG. Overview of EEG, electrode placement, and montages. In: Absolute Epilepsy and EEG Rotation Review. Springer International Publishing; 2019:117-125.
- 45. Ruehland WR, O'Donoghue FJ, Pierce RJ, et al. The 2007 AASM recommendations for EEG electrode placement in polysomnography: impact on sleep and cortical arousal scoring. Sleep. 2011;**34**(1):73-81. doi:10.1093/sleep/34.1.73
- 46. Rundo JV, Downey R. Polysomnography. Handb Clin Neurol. 2019;160:381-392. doi:10.1016/B978-0-444-64032-1.00025-4. 3rd
- 47. Berry RB, Brooks R, Gamaldo C, et al. AASM scoring manual updates for 2017 (version 2.4). J Clin Sleep Med. 2017;13(5):665-666. doi:10.5664/jcsm.6576
- 48. Senaratna CV, Perret JL, Lowe A, et al. Detecting sleep apnoea syndrome in primary care with screening questionnaires and the Epworth sleepiness scale. Med J Aust. 2019;211(2):65-70. doi:10.5694/mja2.50145
- 49. Van Dongen HPA, Maislin G, Mullington JM, et al. The cumulative cost of additional wakefulness: dose-response effects on neurobehavioral functions and sleep physiology from chronic sleep restriction and total sleep deprivation. Sleep. 2003;26(2):117-126. doi:10.1093/sleep/26.2.117
- 50. Fan J, McCandliss BD, Sommer T, et al. Testing the efficiency and independence of attentional networks. J Cogn Neurosci. 2002;**14**(3):340–347. doi:10.1162/089892902317361886
- 51. Nguyen P, Dunbar C, Guyett A, et al. 0072 simple vestibular-occular motor assessment as a predictor of alertness state and driving impairment during extended wakefulness. Sleep Advances. 2023;4(suppl\_1):A29-A29. doi:10.1093/ sleepadvances/zpad035.072
- 52. Dunbar C, Nguyen P, Guyett A, et al. P071 simple vestibular-occular motor assessment as a predictor of driving performance vulnerability following extended wakefulness. Sleep Advances. 2023;4(suppl\_1):A62-A62. doi:10.1093/ sleepadvances/zpad035.156
- 53. Vakulin A, Baulk SD, Catcheside PG, et al. Effects alcohol and sleep restriction on simulated

- driving performance in untreated patients with obstructive sleep apnea. Ann Intern Med. 2009;151(7):447-455. doi:10.7326/0003-4819-151-7-200910060-00005
- 54. Hart SG. Nasa-Task Load Index (NASA-TLX); 20 Years Later. Proc Hum Fact Ergon Soc Annu Meet. 2006;50(9):904-908.
- 55. Akerstedt T, Anund A, Axelsson J, et al. Subjective sleepiness is a sensitive indicator of insufficient sleep and impaired waking function. J Sleep Res. 2014;**23**(3):240–252. doi:10.1111/jsr.12158
- 56. Ftouni S, Sletten TL, Howard M, et al. Objective and subjective measures of sleepiness, and their associations with on-road driving events in shift workers. J Sleep Res. 2013;22(1):58-69. doi:10.1111/j.1365-2869.2012.01038.x
- 57. Weiner BJ, Lewis CC, Stanick C, et al. Psychometric assessment of three newly developed implementation outcome measures. Implement Sci. 2017;12(1):108. doi:10.1186/s13012-017-0635-3
- 58. Jakobsen JC, Gluud C, Wetterslev J, et al. When and how should multiple imputation be used for handling missing data

- in randomised clinical trials a practical guide with flowcharts. BMC Med Res Methodol. 2017;17(1):162. doi:10.1186/ s12874-017-0442-1
- 59. Cox DR. Regression models and life-tables. J R Stat Soc Series B Stat Methodol. 1972;34(2):187-202.
- 60. Bellera CA, MacGrogan G, Debled M, et al. Variables with time-varying effects and the Cox model: some statistical concepts illustrated with a prognostic factor study in breast cancer. BMC Med Res Methodol. 2010;**10**:20. doi:10.1186/1471-2288-10-20
- 61. Etheridge JC, Sinyard RD, Brindle ME. 90--implementation research. Eltorai AEM, Bakal JA, Newell PC, Osband AJ, editors. Translational Surgery: Handbook for Designing and Conducting Clinical and Translational Academic Press, Elsevier Inc. 2023.
- 62. Weaver MD, Robbins R, Quan SF, et al. Association of sleep disorders with physician burnout. JAMA Netw Open. 2020;**3**(10):e2023256. doi:10.1001/jamanetworkopen.2020.23256