

# **Characterising the neurophysiological markers of occupational wellbeing**

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# 1 Background

Work takes up a huge chunk of our adult lives: the average Briton works approximately 42 hours per week,<sup>[1]</sup> with an additional ~4.9 hours spent on commuting,<sup>[2]</sup> and an estimate of ~10.1 hours in unpaid overtime.<sup>[3]</sup> These numbers have been growing in the past 30 years<sup>[1-3]</sup> without benefits to productivity. Importantly, a growing body of evidence suggests a strong negative impact on our health and wellbeing. Long working hours are associated with higher risk of cardiovascular disease,<sup>[4]</sup> higher incidence of depressive,<sup>[5]</sup> and anxiety symptoms,<sup>[4]</sup> deficient cognitive function,<sup>[6]</sup> and adverse physiological changes.<sup>[7]</sup> Moreover, interventional studies show that a reduction in working hours benefits both health and productivity.<sup>[8,9]</sup> However, we do not yet understand the neurobiological implications of our modern, increasingly intense, working patterns. Three reasons motivate the need for such an understanding:

- The brain acts as an interface between the body and the environment, therefore, it is key for grasping the mechanism through which occupational factors are affecting our health and wellbeing.
- Without it we cannot ascertain the true short-term impact of working patterns on our cognitive function and physiological health, let alone the long-term, potentially irreversible, effects on our mental health and wellbeing.
- Scientific evidence is needed to inform public policy and industry standards surrounding healthy work patterns.

## 2 Aim and objectives

This project aims to characterize the neurophysiological processes through which work patterns affect our health and wellbeing, with the following objectives:

- Identify occupational factors that have a meaningful impact on neuronal function and describe the mechanism of impact.
- Assess how physiological inflammatory responses are altered by occupational factors.
- Determine how the identified neuronal and inflammatory markers jointly affect our physical and mental health.

Progress against these objectives will help develop a holistic insight into why our wellbeing is affected by modern work patterns and other occupational factors.

### 3 Rationale

Until recently the impact of working patterns on our neurophysiology has been overlooked, therefore it is difficult to formulate an investigative plan that directly builds on prior work. However, I have identified inadequate sleep as the principal means through which the influence of occupational factors on wellbeing is likely to manifest. First, relative to all other activities, work is the primary waking activity exchanged for sleep.<sup>[10]</sup> Second, it is becoming increasingly common for workers to accumulate sleep debt throughout the working week and attempt to catch-up on the weekend, a countermeasure that has been shown to be ineffective in combating the deleterious effects of weekday sleep debt.<sup>[11–14]</sup> Finally, working longer hours is associated with significantly reduced sleep duration and quality.<sup>[15]</sup> Therefore, we will use the known neuronal and physiological mechanisms of sleep, and in particular sleep restriction, to help guide the incipient stage of our investigation.

A multitude of bodily systems react to and interact with sleep-loss, a key set being the body's inflammatory response, and in particular increased expression of proinflammatory cytokines. Sleep restriction studies consistently found increased levels of interleukin-6<sup>[16]</sup> in response to restricted sleep,<sup>[13]</sup> an effect that is resilient to recovery sleep.<sup>[12]</sup> One mechanism in which this altered inflammatory response affects cognitive and affective processing is via the interoceptive system.<sup>[17]</sup> Afferent signals from peripheral nerves that embed visceral organs communicate to the brain what is happening physiologically in the body, including sensing inflammation. Interoception interacts with many other cognitive processes, such that our bodily feelings determine the way we behave.<sup>[18,19]</sup> Altogether, this suggests that inflammation, via interoception, can drive how we feel and ultimately how we act.

Neurally, the most consistent findings associated with inadequate sleep are: (i) amygdala hyper-reactivity to aversive stimuli;<sup>[20,21]</sup> (ii) disconnect between frontal regions and the amygdala, as well as the basal ganglia<sup>[20,22–24]</sup>; (iii) altered structure and function in the fronto-parietal network.<sup>[25,26]</sup> Furthermore, given its pivotal role in both interoception and the salience-detection network, the insular cortex is likely to be a key mediator of the neurophysiological changes that result from chronic sleep restriction.<sup>[17–19,27]</sup> However, very few studies directly investigate interactions between work patterns, inadequate sleep, and physiology, with none of them further assessing neurobiological changes in the same context. This projects will address the resulting gaps in the literature using a combination of population and cognitive neuroscience, epidemiology and immunological methods.

## 4 Research Outline

### *Stage 1: UK Biobank.*

I will begin by identifying neural markers of occupational wellbeing in the UK Biobank cohort: a population-based prospective study of ~500,000 individuals, a subset of which (~40,000) completed an imaging follow-up, including both task<sup>[28]</sup> and resting-state functional Magnetic Resonance Imaging (fMRI). Please see *Appendix 1* for the proposed timeline.

In a staged exploratory analysis, using a combination of cognitive and population neuroscience methods, I will:

- Identify (task) fMRI activity associated with occupational factors of interest, e.g. hours worked, employment status, commute time, shift work history.
- Use resting-state fMRI to investigate network characteristics of brain regions identified in the task fMRI data.
- Characterize the interactions between neural function and the inflammatory marker available in the dataset, i.e. C-Reactive Protein (CRP).
- Determine how the identified neural and inflammatory markers jointly affect long-term health and wellbeing in the cohort.

### *Training needs:*

- Population neuroscience methods.
  - Organisation for Human Brain Mapping (OHBM) educational course “Population Neuroimaging: How to responsibly handle big data in the age of biobanks” (July 2020)
- Advanced statistics for neuroimaging.
  - OHBM educational course “Machine Learning for Neuroimaging, Learn the Basics before Going Deeper” (Date: July 2020).
  - Oxford fMRIB course on FSL software (Date: TBD).
  - MSc. modules (University of Sussex) “Machine Learning” and “Data Science Research Methods” (self-paced/ad-hoc) for handling big datasets.
- Statistics in epidemiology.
  - self-guided and self-paced.

### *Stage 2. MRI + Immunology data collection*

The UK Biobank has the advantage of a large sample size, but offers a correlational rather than interventional design, and does not include our cognitive tasks of interest, interoceptive measures, or primary data on proinflammatory cytokines. Therefore, findings from stage 1 of the project will be used to inform and shape

an interventional study, carried out in collaboration with another PhD student in the lab. Two groups of participants working in an office environment will be recruited and randomly allocated to different working patterns (exact patterns to be determined by stage 1 findings). To compare how neural and immune status interact we will use neuroimaging (task and resting-state fMRI) and physiological measures (e.g. enzyme-linked immunosorbent assay; ELISA) in combination with cognitive and interoceptive measures (e.g. interoceptive accuracy on heartbeat perception task, impulsivity on stop signal task), as well as assessments of workplace functioning (e.g. team work, job satisfaction, work engagement; mental health). Although sleep is not the primary measure in this study, it will be a critical covariate to neural and immune function, cognition, and occupational functioning. Therefore we will use both sleep watches and self-report questionnaires to assess it.

*Training needs:*

- Continued training and support from Dr Charlotte Rae, who is expert in MRI techniques, in implementing Human Connectome Project (HCP)-style techniques in our analysis.
- Support from Dr Sue Baxter (Director of Innovation and Business Partnerships at Sussex), our local business liaison, in planning recruitment.
- Phlebotomy training to collect blood samples.
- Training on the design, collection and analysis of occupational measures from lab collaborators Dr Emma Russell (University of Sussex Business School) and Prof Tom Ormerod (Psychology, Sussex). These collaborations have been established by Dr Rae in 2020.

***Stage 3. Analysis and write-up.***

The final stage of my project will be primarily focused on the analysis of the data obtained from the interventional study, presenting the work at national and international conferences (e.g. OHBM), and writing up for publication.

*Training needs:*

- Continued training and support from Dr Rae, who is expert in MRI techniques.
- ELISA training from Dr Lisa Mullen (BSMS) for cytokine analysis.
- Support with the interpretation of the physiology data from expert Dr. Jessica Eccles (BSMS).

## 5 Hypotheses and predictions

**H1: *Working patterns will be associated with specific neural markers.*** Based on findings in the sleep literature,<sup>[20–26,29–33]</sup> I predict that:

- In the UK Biobank data, working longer hours will be associated with amygdala hyper-reactivity in response to emotional faces in the task fMRI.
- In the UK Biobank data, working longer hours will be associated with reduced functional connectivity between the prefrontal cortex and the amygdala in task and resting-state fMRI, an effect mediated by the insular cortex.
- In the UK Biobank data, working longer hours will be associated with reduced functional connectivity within the salience-detection network, executive control, fronto-parietal, and default mode (DMN) networks in resting-state fMRI.
- In the UK Biobank data, working longer hours will be associated with attenuated anticorrelation between task-negative (i.e. DMN) and task-positive regions (i.e. executive control, fronto-parietal, and salience-detection networks) in resting-state fMRI.
- The above findings will be echoed in the local interventional study.
- The intervention to reduce working hours will result in a reversal of these effects.

**H2: *Occupational factors will affect physiological immune function, in part, through altering sleep patterns.*** Given the known neurophysiological consequences of sleep restriction,<sup>[12,13,34]</sup> and the effect of working patterns on sleep duration and quality,<sup>[10,11,15]</sup> I predict that:

- Working longer hours will be associated with higher concentrations of proinflammatory cytokines and related proteins/hormones: CRP in the UK Biobank data; e.g. IL-6 and/or cortisol in the local data.
- The intervention to reduce working hours will lead to lower (vs. baseline) levels of IL-6 (as measured through ELISAs).

**H3: *Interoception will mediate the neurophysiological impact of work patterns.*** Given its pivotal role in both interoception and the salience-detection network, the insular cortex is likely to be key.<sup>[17–19,27]</sup> Thus, I predict:

- Levels of IL-6 will track insular activity in the fMRI data (UK Biobank and local), according to participants' improved sleep patterns.
- Working longer hours will be associated with worse performance on interoceptive measures (e.g. heartbeat perception task) in the local intervention.

*H4: Work patterns will impact cognitive function and workplace performance.* Based on work time reduction interventions,<sup>[8,35]</sup> I predict that:

- Working longer hours and other time-consuming occupational factors will negatively correlate with cognitive measures in the UK Biobank (after controlling for confounds).
- Working longer hours and other time-consuming occupational factors will negatively correlate with cognitive (e.g. stop signal task) and occupational factors (e.g. team work, job satisfaction, work engagement; mental health) as measured in the local intervention.
- The intervention to reduce working hours will improve cognition and workplace functioning (measures above).



## 6 Risks

- Employers might not be interested or willing. However, Dr Rae has recruited several collaborators with various employer links, i.e. Sue Baxter in Research & Enterprise, Emma Russell in Business School, Tom Ormerod, head of Applied Behavioural Sciences in Psychology. This forms a multi-armed strategy that greatly increases the likelihood of finding employers that are willing and able to participate.
- CISC may not be operational for research scanning by the time we want to start the local study due to Covid19. While unlikely, as the current plan is to re-initiate research in the autumn (2020) and we won't be looking to start data collection until summer 2021, there is a possibility of subsequent pandemic waves. In that case, we plan to pause MRI acquisition and focus on UK Biobank analysis and publication of findings, as well as collection of pilot data for the local study that does not require MRI or blood sampling and can be done remotely, e.g. questionnaires, cognitive tests.
- Lack of local experts in handling MRI datasets of this size. However, second supervisor - Prof Jamie Ward - has experience with big data datasets (e.g. database of thousands of synaesthetes). Moreover, I am keen to learn methods for handling large datasets and apply them to our MRI data, and there is an outstanding community of Data/Network Scientists at Sussex who offer educational courses locally, and can also be approached for help (e.g. Prof Luc Berhouze). Finally, Dr Rae can also facilitate assistance from Prof Steve Smith and colleagues at Oxford's FMRIB, a group that is playing a major role in several Big Data imaging projects, including HCP and UK Biobank Brain Imaging.

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**Appendix 1.** Provisional research plan.

