# Distribution of Working Hour Characteristics by Race, Age, Gender, and Shift Schedule among U.S manufacturing workers 

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#### Abstract

Shift work is a common occupational exposure, however, few studies have examined aspects of shift work beyond night work and long hours, such as rotational patterns or weekend work, which may contribute to poor health through disruption of the body's circadian rhythms. In this manuscript, we calculated the prevalence of working hour characteristics using algorithms for type (e.g., day), duration, intensity, rotational direction, and social aspects (e.g., weekend work) in a nationwide cohort of American manufacturing workers ( $\mathrm{N}=23,044$ ) between 2003-2014. Distributions of working hour characteristics were examined by schedules (e.g., permanent day, day/night) and demographics, and were cross-classified in a matrix to examine co-occurrence.

Approximately $55 \%$ of shifts may cause circadian rhythm disruption as they were non-day shifts or day shifts with a quick return or rotation, or were 13 hours or longer. Older workers, female workers, and White workers worked permanent day shifts most often, while workers of color worked more day/night schedules. Night and evening shifts had more frequent shift rotations, quick returns, and longer hours than day shifts. Yet, day shifts, which are presumed to have little negative circadian impact, may cause circadian rhythm disruption as long hours, quick returns and rotations also occurred within day shifts.


## Keywords

shift work; circadian disruption; joint distribution; working time; shift domains

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## Introduction

Shift work continues to be an important occupational exposure with a prevalence of near $20 \%$ of the US workforce (Demetriades and Pedersini 2008; Straif et al. 2007; United States Bureau of Labor 2004). Shift work has been associated with increased risk of cardiovascular disease (Mosendane, Mosendane, and Raal 2008; Skogstad et al. 2019; Lunde et al. 2020; Akerstedt et al. 1984; Hublin et al. 2010), injury(Mustard et al. 2013; Nielsen et al. 2011), hypertension (Manohar et al. 2017; J. M. Ferguson et al. 2019), breast cancer (Hansen 2017), psychological and mental health disorders (Lee et al. 2017; Costa 2010), diabetes (Pan et al. 2011; Morikawa et al. 2005; Gan et al. 2015; Knutsson and Kempe 2014), metabolic syndrome (Lu et al. 2017; Lin, Hsiao, and Chen 2009; Wang et al. 2014) and fatigue (Cunningham et al. 2022). However, the term 'shift work' is often vaguely defined and generically used to describe any non-standard work schedule that has one or more characteristics such as occurring at night, changing start times (rotational work), or long hours (Straif et al. 2007). Yet, definitions of these characteristics of shift work are not standardized or well described across working populations. Moreover, few studies have examined aspects of shift work beyond night work and long hours, such as rotational pattern, limited time off, or weekend work, which may also contribute to increased risks of adverse health outcomes.

To clarify adverse aspects of shift work and improve exposure classification, more specific definitions of shift work have recently been proposed - "working hour characteristics" (Stevens et al. 2011). Working hour characteristics classify specific components of work, such as night work or long hours, which may be relevant for worker health. Working hour characteristics were categorized into large 'domains' of interest defined by the International Agency for Research on Cancer Working Group in 2009 following their 2007 classification of "shift work that involves circadian rhythm disruption as a probable human carcinogen" (Straif et al. 2007; Stevens et al. 2011). While many domains were identified in the IARC report, five key domains of interest that can be calculated from time registry data are 1) Shift type, 2) Duration, 3) Intensity, 4) Rotational Pattern, and 5) Social aspects of working time; with each containing several working hour characteristics (Stevens et al. 2011; Straif et al. 2007). These five domains are described as follows:

The shift type domain contains working hour characteristics of morning, day, evening, and night shifts. These working hour characteristics are defined by starting time and duration, to estimate displacement from solar day and the resulting circadian phase shift. While the impact of night shifts on human health have been studied extensively (Manohar et al. 2017; Hansen 2017), shifts with start times in early morning or evening may be equally disruptive to circadian rhythms, while day shifts are presumed to have a no impact (Härmä et al. 2015).

The duration domain characterizes the length of shift, workday, or work weeks in order to capture the displacement of normal sleeping times. Long working hours are risk factors for diabetes and cardiovascular disease (Kivimäki, Jokela, et al. 2015; Kivimäki, Virtanen, et al. 2015; Hannerz, Larsen, and Garde 2018; Hannerz et al. 2018). Longer shifts may indirectly cause circadian rhythm disruption by reducing recovery time between working
periods which impacts the speed at which a worker entrains their circadian rhythm to solar day (Stevens et al. 2011). Long working hours may also independently impact worker health through sleep disruption and resulting fatigue (Cunningham et al. 2022).

The intensity domain contains working hour characteristics such as quick returns, which are designed to capture reduced recovery time between working periods, while the rotational direction domain contains working hour characteristics like the frequency and direction of rotation. By capturing rotation frequency, we hope to estimate the effect of repeat circadian rhythm phase shifts (Stevens et al. 2011; Straif et al. 2007).

The rotational direction domain distinguishes clockwise/forward rotating (morning to afternoon to night shift) from counter clockwise/backward rotating (night to afternoon to morning shift). The last domain, social aspects of working time, includes working hour characteristics such as weekend work which are critical for maintaining regularity of household and family tasks (Straif et al. 2007).

Previous studies suggest working hours that combine multiple characteristics, such as night work and rotating shifts, may confer multiplicative or more than additive increases in risk of adverse health outcomes (J. M. Ferguson et al. 2019; Straif et al. 2007). Prior work has also emphasized the need to conceptualize working hour characteristics as a 'ecosystem' rather than evaluate risks in one dimension at a time (S. A. Ferguson and Dawson 2012). However, evidence is limited as the co-occurrence of the different characteristics among a worker population have not been examined; as cohort studies to date are not well suited to classify more than one domain due to lower resolution data sources such as surveys (Härmä et al. 2015). A major limitation of the existing literature is the lack of detail regarding shift work exposure. Most studies classify shift work into dichotomous metrics of night work vs. day work, rotational work vs. non-rotational work, or long hours vs. regular hours due to self-reported and low-definition data sources such as questionnaires. These general and individual classifications limit our understanding of which components of shift work are responsible for increased risk of poor health through circadian rhythm disruption. In order to understand the etiological effect of shift work on human health, it is critical to examine the joint impact of working hour characteristics.

The goal of this study was to operationalize these domains in a US manufacturing cohort using daily administrative time clock data. In this report we identify the co-occurrence of different working hour characteristics classified by domains of shift type, duration, intensity, rotation pattern, and social aspects of working time in a cohort of light metal manufacturing workers. We also identify potential social disparities in exposures potentially related to circadian rhythm disruption by describing the distribution of working hour characteristics by demographics and annual shift schedules.

## Methods

## Study Population

The subset of the American Manufacturing Cohort (AMC) population eligible for this analysis includes 28,331 active hourly workers with time-registry data (Elser et al. 2019).

Workers were employed between 2003 and 2014 and performed blue-collar work (i.e. jobs requiring manual labor) in smelters, refineries and fabrication in jobs such as anode assembly operator, sheet finishing, pack/ship operator, casting, autoclaving, and electrical or mechanical maintenance (Noth et al. 2013). Information on employee demographics and employment histories were obtained from deidentified company personnel files, employment records, and insurance claims. Workers were employed in 54 plants; 51 of which operated 24 hours a day, 7 days a week. To evaluate the distribution of work time patterns among full time employees, the study population was limited to employees working more than 150 work days a year $(\mathrm{N}=23,095)$ and excluded 5,236 part-time workers. Plants with fewer than 50 employees were excluded ( $\mathrm{N}=3$ plants, 51 workers). The final study population included 23,044 workers with over 22.4 million shifts at 51 plants.

## Sources of Working Time \& Data Quality

Daily working hour data retrieved from two time-registry systems spanning 2003-2009 and 2009-2014 were used to calculate hours worked from January $1^{\text {st }} 2003$ through December 31, 2014. The data included details on start and end times of a shift to every billable second (i.e., the smallest time unit) and their associated pay codes (e.g., surcharges due to night shifts, overtime hours, call-in work). Data also included what each unit of time corresponded to in terms of active work time and compensation (e.g., grace time to put on personal protective equipment and walk to station, sick time/paid time off, vacation, or unexcused absence).

Time data were cleaned following previously described time-oriented data cleaning taxonomies (Gschwandtner et al. 2012). Consecutive working hours with less than one hour between them were considered one continuous shift as short gaps between billable hours were overwhelmingly associated with and coded as meal breaks. Data were compressed into one row keeping the earliest starting time and/or the latest ending time. Shifts over 18 hours $(<1 \%)$ were excluded as they likely represented paid time during which employees were allowed to sleep (e.g., manager on-call hours). Shifts less than 3 hours were excluded ( $<1 \%$ ) similar to prior work as shifts smaller than 3 hours cannot be defined as a night or day shift (Härmä et al. 2015). Shifts that represented paid and non-paid time off work (e.g., sick leave, vacation etc.) were excluded ( $\mathrm{N}=2.5$ million)

## Definitions of Annual Shift Schedule

Person-years were classified into annual shift schedules by combinations of permanent and rotating day, evening, and night. Shift schedules were defined using definitions developed by Garde et al. 2018, where schedules are intended to capture the predominant pattern of work. For example, a "permanent day schedule" was a person-year with $\geq 6.7 \%$ day shifts ( 10 or fewer shifts a year) and $<6.7 \%$ evening and $<6.7 \%$ night shifts. In comparison, a "day/night schedule" had $\geq 6.7 \%$ day and $\geq 6.7 \%$ night shifts but $<6.7 \%$ evening shifts (Garde et al. 2018). Morning shifts were considered day shifts when defining yearly shift schedules in this cohort due to their rarity and similarity in start times and duration similar to work by Garde et al. 2018.

## Definitions of Working Time Characteristics

The definitions for each working hour characteristic are presented in Appendix Table 1. Shifts were classified using binary definitions for working time data developed by Härmä et al. 2018 and Garde at al. 2018 for shift type, quick returns, and long shifts. These definitions were first implemented in a Scandinavian healthcare work force (Garde et al. 2018). Therefore, to accommodate the norm of longer shifts and more hours worked during the week in this sector of the American manufacturing work force, supplemental definitions were added by modifying binary variable cut-points. Modifications included a secondary definition for long shifts (from $\geq 12$ hours to $\geq 13$ hours) and two alternative definitions for long work weeks (from $\geq 40$ hours to $\geq 48$ and $\geq 60$ hours). The definition for a morning shift was also slightly adapted to fit this population as workers for the 6:00am shift often clocked in 10-15 minutes prior to their shift start to prepare for their shift (e.g., unpaid time where workers put on protective equipment and walk to work station). Therefore, we defined morning shifts as a shift that starts after 03:00 and not later than 05:30 (Härmä definition: 06:00). Day shifts were defined as a shift that starts after 05:30 (Härmä definition: 06:00) and ends no later than 21:00. Novel definitions for the direction of rotations were developed from previously applied definitions for classifying rotations in this cohort (J. M. Ferguson et al. 2019).

## Statistical Analysis

We calculated the frequency of working hour characteristics of shift type, quick returns, long shifts, rotation direction, and weekend work over 12 years. We then examined four joint distributions. First, the distribution of annual shift schedule by age, race and gender was examined (i.e., what proportion of Black workers worked the permanent night shift schedule). Second, the prevalence of each working hour characteristic by person year and annual shift schedules was examined (i.e., what proportion of shifts worked by permanent day workers were night shifts). Third, the prevalence of each working hour characteristic by age, race and gender (i.e., what proportion of shifts worked by Black workers were night shifts). Fourth, each working hour characteristic was cross-classified in a matrix to examine its co-occurrence with all other working hour characteristics (i.e., what proportion of night shifts were also long shifts).

Non-parametric tests of trend across ranks of ordered groups (an extension of the Wilcoxon rank sum test)(Cuzick 1985) and chi-squared tests were used to identify trends and the statistical significance of differences $(a=0.05)$ between categories of annual shift schedules, race, age categories, and gender. All data cleaning and statistical analyses were conducted on deidentified data and performed in Stata version 15, 2017 (StataCorp LLC, College Station TX). Clock plot graphics were produced using R software (version 3.5.2) with code adapted from Zoonekynd et al. (Zoonekynd and Gama 2012). The Institutional Review Board at the University of California, Berkeley (Protocol ID: 2010-07-1823) and at Stanford University (Protocol ID: 55306) approved this study.

## Results

This study population includes 23,044 eligible workers (Table 1) with over 22.4 million shifts worked. While the cohort comprised mostly White men between ages 30-60 years old, $25 \%$ of the cohort was non-White and the most common racial group after White was Black/African American ( $14 \%$ of workers). Of the 51 plants in the cohort, only seven were followed for the full 12 years. The mean length of follow-up across locations was four years. Due to the change in time-registry systems in 2009 and the acquisition of new plants, the distribution of plants and employees changed over the course of the study period. On average, for each year between 2003-2008, roughly 7,000 workers were employed in 30 plants. In 2009, the year of transition between the two time-registry systems, only 4,183 were employed in 17 plants, but between 2010 and 2014, on average 10,500 workers were employed across 31 plants, representing new plant acquisitions.

All plants operated with either two 12 -hour shifts or three 8 -hour shifts. The majority of the plants operated 24 -hours, 7 days a week; however, three plants had a day shift of either 8 or 12 hours but no night shift. As seen in the Figure 1 plot titled "All Shifts", plants staffed fewer workers at night compared to during the day. However, the presence of night workers varied by location from a skeleton staff to a modest $10 \%$ reduction in workforce at night (data not shown).

## Distribution of Demographics by Annual Shift Schedule

Approximately half of the workers were on a rotational schedule, while the other half worked a permanent schedule each year (Table 1). The most common annual schedules were permanent day and rotating day/night. Differences in the distribution of annual schedules were identified by gender, race and age. Men were more likely to work rotational schedules than women ( $54.7 \%$ vs. $42.7 \%$ of person-years, chi squared $\mathrm{p}<0.01$ ). Yet, more women worked permanent night schedules than men ( $15 \%$ vs. $11 \%$ ). White workers worked permanent day shifts most often, while minorities including Black, Hispanic, or American Indian workers were more likely to work day/night schedules. A strong age trend was detected, as older workers were more likely to work permanent day shifts ( $\mathrm{p}<0.01$ ) and less likely to work day/evening/night schedules ( $\mathrm{p}<0.01$ ) and day/night schedules compared with younger workers (Table 1 and Appendix Figure 1, Test for trend: p<0.01). The largest proportion of permanent night workers were 60 years of age or older.

## Descriptive Statistics of Working Hour Characteristics in a Year

On average, each subject worked 227 shifts in each year; however, about $10 \%$ of the population worked between 280 and 455 shifts per year (Table 2). The number of shifts can exceed the number of days due to the presence of split shifts (multiple shifts $<6$ hours per day with a break of more than an hour in between). In this population, it was normal to work one to two weeks without a day off and to work $40 \%$ of the Saturdays and Sundays in a year ( 45 of the total 105 weekend days per year). The average work week was 42 hours long. While a worker on average rotated 19 times in a year, there was large variation, with some workers never rotating (e.g., permanent schedules) while others rotated almost every other shift.

## Distribution of Working Hour Characteristics by Demographics

The majority of the shifts worked by men occurred in daylight hours. However, compared with women, men worked over twice the number of shifts with quick returns ( $2.5 \%$ vs $5.8 \%)$, shifts with very quick returns $(0.9 \%$ vs. $1.9 \%)$, shifts that were longer than 13 hours ( 1.8 vs. $6.3 \%$ ), work weeks longer than 60 hours ( $1.0 \%$ vs. $2.2 \%$ ) and near twice the number of shifts with a rotation ( $4.7 \%$ vs $9.3 \%$ ) (Table 3 ). Women had higher proportions of shifts that were evening shifts or morning shifts, lower proportions of shifts that occurred on the weekend, and similar proportions of night work compared to men.

Over $50 \%$ of the shifts worked by White workers were day shifts compared to $39.7 \%$ to $48 \%$ among persons of color (Table 3). American Indian/Alaska Native persons and Hispanic/ Latino persons had twice the proportion of morning shifts than all other race and ethnicity groups. American Indian/Alaska Native workers also had the highest proportion of shifts with extended hours ( $40.6 \%$ of shifts $>12$ hours, $7.3 \%$ of weeks $>48$ hours and $2.6 \%$ of weeks over 60 hours). Black/African American workers and Multi-racial workers had the highest proportion of shift with a rotation, but American Indian/Alaska Native workers had the highest proportion of shifts with a flipped rotation.

Shifts worked by older workers had higher proportions of morning shifts, days shifts and shifts with a quick return or a very quick return (Table 3). Shifts worked by younger workers had higher proportions of evenings shifts, night shifts, weekend shifts, and shifts with rotations. While younger workers had higher proportions of shifts that were longer than 12 hours, older workers had higher proportions of shifts that were longer than 13 hours. There were only marginal differences between the proportion of work weeks with extended hours by age.

## Distribution of Working Hour Characteristics by Annual Shift Schedule

Distributions of quick returns, shift length, rotations, and amount of time off-work varied by annual shift schedule as well (Table 4). Permanent day workers had the lowest percentage of quick returns, rotations and weekend work, as well as long shifts ( $\geq 13$ hours) and long work ( $\geq 40$ hours/week) despite the inclusion of morning shifts in the definition of permanent day work. Notably, day/evening and day/evening/night schedules had higher percentages of quick and very quick returns to work, as well as shifts 13 hours or longer. Additionally, day/ evening/night shifts had the highest percentages of rotations (19\%) followed by day/night schedules ( $16.9 \%$ ). Shift duration, measured by length of hours per shift or week, fluctuated only slightly across annual shift schedules, with the exception of day/night schedules that had more 12 -hour shifts than any other schedule

## Co-occurrence of Working Hour Characteristics

Shifts were classified into morning (5.5\%), day (50.2\%), evening ( $16.2 \%$ ), and night ( $28.1 \%$ ) (Table 5). Approximately $54.6 \%$ shifts occurred at non-day hours, included a quick return, included long hours ( $\geq 13$ hours), or included a rotation, thus fall into categories that are hypothesized to cause circadian rhythm disruption.

Overall, the probability of co-occurrence between pairs of working hour characteristics varied substantially. Among day shifts, $23.9 \%$ of shifts were 12 hours or longer, $6.2 \%$ included a rotation, and $3.6 \%$ were quick returns. Compared with day shifts, night shifts were more likely to be 12 hours or longer ( $48.2 \%$ ), however, evening shifts were most often 13 hours or longer ( $13.6 \%$ ). Night and evening shifts had the highest joint probability with any type of rotation, but nights were twice as likely to include a flipped rotation when compared with day ( $6.1 \%$ vs. $3.2 \%$ ). Forward and flipped rotations rarely occurred with a quick return ( $<1 \%$ ), while $62.1 \%$ of backward rotations coincided with a quick return (<11 hours between shifts), and $25.1 \%$ with a very quick return ( $<8$ hours between shifts).

Nearly all instances of quick returns co-occurred with the following conditions: a backwards rotation $(11.6 \%)$, a shift longer than 12 hours ( $0.76 \%$ ), the previous shift was longer than 12 hours ( $31.8 \%$ ), or a combination of all three $(50.2 \%)$. The remaining $6 \%$ of quick returns were attributable to a worker coming in earlier or staying later than normal but not with a large enough difference to cause a rotation or qualify as a long shift (i.e., a shift <12 hours long and starting <6 hours earlier).

Working shifts longer than 12 hours was fairly common in this cohort (30\%) and working shifts longer than 13 hours was relatively rare (5.6\%). Compared with shifts shorter than 12 hours, shifts longer than 13 hours had a tenfold higher prevalence of co-occurring with a backward rotation ( $16.3 \%$ vs. $1.7 \%$ ) or co-occurring with a very quick return ( $12.2 \%$ vs. $1.4 \%$ ). Weekend and weekday shifts had roughly the same joint probability with all working hour characteristics with the exception of shift length; weekend shifts were more often 12 hours or longer ( $40.5 \%$ vs. $27.7 \%$ ). However, there was a negligible difference in the frequency of shifts 13 hours or longer ( $5.8 \%$ vs. $5.5 \%$ ) among weekend and weekday shifts.

## Discussion

Our results provide evidence that working hour characteristics hypothesized to cause circadian rhythm disruption have a varying distribution across shift schedules and demographic characteristics. While the literature has primarily focused on the health impacts of night work, rotations, or long work, little attention has been paid to the co-occurrence of working hour characteristics. In this cohort, night and evening shifts were more commonly associated with longer work hours, rotations, and quick returns compared to morning shifts or day shifts. Assuming an additive effect, night and evening shifts with longer work hours, rotations, or quick returns may confer more disruption to workers' circadian rhythm which may contribute to the diverse adverse health effects seen among night workers.

Furthermore, these working hour characteristics that may cause circadian rhythm disruption were not exclusively found in night or evening shifts. As expected, the day shift had the lowest co-occurrence with quick returns, long work hours or weeks, and rotations. However, working the day shift did not provide absolute protection from potentially disruptive characteristics of working hours since long work hours, as well as quick returns and rotations occurred when workers switched from morning to afternoon shifts (both considered day work). Our work suggests that day workers are exposed to potentially circadian rhythm disruptive shifts despite not working during biological night. This calls
into question to de-facto assumption that day workers are an appropriate 'unexposed' group for shift work as circadian rhythm disruption may be caused in part by long work hours, rotations, or quick returns.

Of note, circadian rhythm disruption can be caused both directly through a phase shift (such as those caused by a shift rotation) or indirectly through the disruption of the sleep/ wake cycle which are important for phase shift, phase resetting, and phase maintenance. Both quick returns to work and long working hours may cause a disruption of the sleep/ wake cycle by restricting the number of non-work hours and hours available for sleep. Furthermore, the association between long working hours and adverse human health may be modified by the interaction of long working hours with non-day shift work as long shifts may extend the hours working in a bright area and therefore increase the resulting phase delay for workers on non-day shifts.

We also identified differences in the occurrence of specific patterns of rotation direction (forward, backward, or flipped) and shift type. Flipped rotations more often co-occurred with the 12-hour schedule of night/days whereas backward rotations were seen primarily with night shifts on an 8-hour schedule. Forward rotations occurred equally among day, night, and evening shifts. The direction of a rotation is important to consider because forward rotations may be less disruptive to the circadian system than backwards or flipped rotations (Knauth 1996; Bambra et al. 2008; Stevens et al. 2011). Anecdotal evidence indicates that workers prefer forward rotation schedules over backwards rotation schedules, likely because forward rotation schedules allow a worker to 'sleep-in' rather than wake earlier (Stevens et al. 2011; Knauth 1996; Bambra et al. 2008). Yet, little is known about the impact of forward versus backward rotations on health outcomes. The majority of quick returns and very quick returns are due to long shifts and rotations. However, a small fraction of quick returns is due to working double shifts. While working a double or long shift may be due to an unanticipated workforce shortage, some quick returns may be built into the shift system and represent a possible area of intervention.

An unexpected finding was that the percentage of shift type, quick returns, and rotations varied minimally between weekday or weekend shifts in this population. This suggests that assessing the impact of weekend shifts may not be influenced by shift type, quick returns, or rotations in this population. As expected, working hour characteristics varied by annual shift schedule as well. Most notably, day/night and day/evening/night schedules had more rotations on average than the day/evening or evening/night schedules which might indicate a slower pattern of rotation among the later.

We assessed the average yearly percentage of rotations rather than the speed of rotations (i.e., number of shifts between rotations). We note that regular fast shift rotations which occur every one to three days would correspond to an annual average of $>33 \%$ rotations in a year. Intermediate shift rotations which occur one a week would correspond to an annual average of roughly $20 \%$. Slow shift rotations occur every 15-30 days or longer would correspond to an annual average between 5-10\% (Stevens et al. 2011). Our results show that, on average, workers rotate about every two weeks, and workers on the day/night or day/evening/night schedules are rotating about every week. Slower patterns of rotations
are hypothesized to have a smaller impact on the circadian system since slower speed corresponds with fewer rotations, allowing a worker to acclimatize their circadian system to the new schedule before the next rotation. However, there might be some benefit to a faster rotating system in which the worker switches start times too frequently for the circadian system to entrain itself to the new schedule (Bambra et al. 2008). Currently, it is still unclear if a constant state of circadian misalignment associated with fast rotations is better than disrupting it periodically with a slower rotation schedule (Moreno et al. 2019). Future work should more directly examine the frequency of rotations (e.g., times of high frequency of rotations followed by low frequency) and their co-occurrence with the characteristics of working hours.

When assessing the differences in yearly shift schedules and working hour characteristics by age, our results indicated a strong age trend. Older workers are more likely to work a permanent day schedule than younger workers. Older workers also had lower proportions of shifts with more than 12 hours, but higher proportions of shifts longer than 12 hours and similar proportions of long work weeks compared to younger workers. This suggests that older workers may be less likely to work the 12 -hour shifts, but when they do, they are more likely to work daily overtime ( $\geq 13$ hours). These patterns may be due to older workers with seniority expressing shift schedule preferences. However, we have no information on the proportion of preferred shifts granted in this population.

We also identified differences in the proportion of workers in permanent or rotational schedules by race and gender. Black/African American workers were the most likely to perform work with rotations, similar to the survey done by the Bureau of Labor Statistics in 2004 (United States Bureau of Labor 2004). We also found that American Indian/Alaska Native workers had higher proportions of shifts that were morning shifts, longer than 13 hours, and weeks that were longer than 40/48/60 hours. These difference by race and ethnicity likely reflects differences in racial composition by job type, due to underlying social factors such as institutionalized racism and higher rates of poverty among racial minorities in America.

Similar to other studies, we found that more women worked permanent night, permanent evening, and permanent day shifts compared to men; with over $37 \%$ of women working the permanent day shift (Ghaziri et al. 2019; United States Bureau of Labor 2004; Straif et al. 2007). This pattern might be because women tend to select the day shift more often due to child rearing and meal preparation duties during the evening and night (Ghaziri et al. 2019; Mustard et al. 2013). Alternatively, a permanent schedule, even permanent nights, affords a predictability that makes arranging child-care easier (Ghaziri et al. 2019; Mustard et al. 2013). While men worked higher proportions of day shifts than women, they may be at an increased of circadian rhythm disruption due to the higher (nearly double) proportion of their shifts that have a quick return, shifts longer than 13 hours, shifts with rotations, and long work weeks.

Identifying differences in working hour exposures is the first step in addressing the causes and consequences of circadian rhythm disruption in vulnerable populations such as young or new workers, aging workers, female workers and minority workers (Cunningham et
al. 2022). While the field is moving towards refining exposure assessment in studies of shift work, large-scale quantitative studies and in-depth qualitative research are needed to further contextualize and understand the complex and competing motivations for selecting into shift work such as monetary compensation, work-life balance, or schedule autonomy. Furthermore, we encourage researchers to consider the intersectionality of shift systems, sociodemographic characteristics and organizational systems; and the impact they may have on worker health. Future studies should also consider the multiple and overlapping sociodemographic characteristics (e.g., being young and female, being old and identifying as a racial minority) in tandem with shift work exposures; rather than independently evaluating each as a single dimension.

Our study has a few limitations. First, while this study benefits from data captured in an administrative time-registry used to document worker's hours for payroll calculation, our data is limited to that captured by human resources. We have no information regarding an individual's chronotype or preference for working days or nights. Individual chronotype is just one of the many unmeasured confounders or effect measure modifiers that may affect both working hours and worker health (Costa 2003; Straif et al. 2007). Second, the results from this study may have limited generalizability as they describe employees at a single American firm in a single industry (Elser et al. 2019). However, there remains considerable diversity in this population. Of the 51 plants in this subset of the AMC only six were unionized under the same union contract, 27 were unionized under local union contracts, and 18 were not unionized and were therefore governed under location-specific shift schedules.

This study employs a novel methodology of assessing the joint probabilities of working hour characteristics. Furthermore, it is the only description of working hour characteristics derived from objective time-registry data in the US and thus represents actual work time in an American manufacturing cohort (Elser et al. 2019). This study also updates our understanding of disparities in annual shift schedules by race, gender, and age among American workers, in a rapidly changing workforce.

## Conclusion

This research identified patterns in the joint distributions of working hour characteristics that may impact circadian rhythms by shift schedules, race, gender, and age. Night and evening shifts had more frequent shift rotations, quick returns, and longer work hours than day shifts which may confer higher levels of circadian rhythm disruption. Yet, day shifts, traditionally considered to have little negative circadian impact, may still be associated with circadian rhythm disruption as long hours, quick returns and rotations also occurred within day shifts. Younger, male, Hispanic or Black workers were disproportionately working rotational schedules, suggesting potential health disparities may exist. These patterns highlight the need to account for multiple working hour characteristics when assessing health outcomes in relation to working hour exposures.

## Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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## Disclosure Statement:

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## Data availability statement:

Due to the nature of this research, participants of this study did not agree for their data to be shared publicly, so supporting data is not available.

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Figure 1:
Proportion of Worker-hours by Hour in a 24 -hour Clock: Stratified by Shift Type in the American Manufacturing Cohort (AMC) 51 plant cohort 2003-2014, USA (N=98,771 person-years)
Shading reflects proximity to solar noon (yellow/light grey in greyscale) and midnight (black).
Length of each wedge represents the percentage of worker-hours within each hour relative to the total number of worker-hours in the plot- stratified by shift type. External circle (with 24 hour ticks) represents $10 \%$ of worker-hours in the plot. Inner circle represents 5\% of worker-hours in the plot. Example interpretation: Among evening shifts, roughly $5 \%$ of worker-hours occur between 13:00 and 14:00 while $10 \%$ of worker-hours occur between 14:00 and 15:00.

| Demographic Characteristics by Annual Shift Schedule in the American Manufacturing Cohort (AMC) 51 Plant Shift Work Cohort 2003-2014, (N= 98,771 person-years) |  |  |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Number of Persons | Number of Person-years | Annual Shift Schedule (\% of person-years) |  |  |  |  |  |  |
|  |  |  | Permanent Day | Permanent Evening | Permanent Night | Day/Evening | Day/Night | Evening/Night | Day/Evening/ Night |
| All persons | 23,044 | 98,771 | 32\% | 4\% | 11\% | 11\% | 25\% | 4\% | 13\% |
| Gender |  |  |  |  |  |  |  |  |  |
| Male | 18,800 | 82,830 | 31\% | 3.4\% | 11\% | 11\% | 27\% | 3.7\% | 14\% |
| Female | 4,244 | 15,941 | 37\% | 5.3\% | 15\% | 12\% | 17\% | 4.8\% | 8.6\% |
| Race |  |  |  |  |  |  |  |  |  |
| American Indian or Alaska Native | 162 | 625 | 30\% | 4\% | 11\% | 8.8\% | 36\% | 2.2\% | 8\% |
| Asian/Native Hawaiian/ Other Pacific Islander | 418 | 1,417 | 26\% | 4.2\% | 14\% | 16\% | 21\% | 6.1\% | 12\% |
| Black or African American (Not Hispanic or Latino) | 3,212 | 13,091 | 22\% | 3.5\% | 11\% | 8.5\% | 33\% | 6.1\% | 16\% |
| Hispanic or Latino | 1,759 | 6,085 | 28\% | 3.3\% | 14\% | 11\% | 31\% | 4.3\% | 8.3\% |
| Multi-racial (Not Hispanic or Latino)/ Unknown | 110 | 350 | 22\% | 1.7\% | 17\% | 12\% | 25\% | 5.1\% | 18\% |
| White (Not Hispanic or Latino) | 17,383 | 77,203 | 34\% | 3.8\% | 11\% | 11\% | 24\% | 3.4\% | 13\% |
| Age |  |  |  |  |  |  |  |  |  |
| 18-<30 years | 3,484 | 8,464 | 15\% | 2.8\% | 15\% | 8.8\% | 37\% | 5.5\% | 17\% |
| $30-<40$ years | 4,887 | 18,001 | 22\% | 2.2\% | 14\% | 8.2\% | 32\% | 4.5\% | 17\% |
| $40-<50$ years | 6,669 | 27,865 | 31\% | 3.3\% | 12\% | 10\% | 26\% | 4.2\% | 13\% |
| 50-<60 years | 6,831 | 36,549 | 39\% | 4.4\% | 9\% | 13\% | 20\% | 3.1\% | 11\% |
| $60+$ years | 1,173 | 7,892 | 43\% | 6.3\% | 9.9\% | 13\% | 16\% | 2.9\% | 8.8\% |

Table 2:
Descriptive Statistics of Yearly Counts of Working Hour Characteristics Across all Person-Years $\geq 150$ shifts/ year in the American Manufacturing Cohort (AMC) 51 Plant Shift Work Cohort 2003-2014, USA (N= 98,771 person-years)

| Domain | Working hour characteristics | Counts per Person-Year |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | Mean | P25 | Median | P75 | P90 | Max* |
| Working Time | Work shift | 227 | 192 | 230 | 256 | 280 | 455 |
|  | Work week | 51 | 51 | 52 | 52 | 53 | 53 |
| Shift Type | Morning | 12 | 0 | 0 | 2 | 28 | 327 |
|  | Day | 114 | 24 | 97 | 195 | 235 | 442 |
|  | Evening | 37 | 0 | 3 | 36 | 156 | 345 |
|  | Night | 64 | 0 | 26 | 95 | 194 | 362 |
|  | Non-day | 113 | 21 | 97 | 191 | 243 | 393 |
|  | Non-night | 163 | 95 | 182 | 234 | 260 | 443 |
| Shift Intensity | Quick return | 12 | 0 | 2 | 13 | 38 | 368 |
|  | Very quick return | 4 | 0 | 0 | 2 | 10 | 214 |
|  | Maximum number of consecutive shifts in a row | 13 | 5 | 9 | 16 | 26 | 360 |
| Shift Duration | Long shift |  |  |  |  |  |  |
|  | $\geq 12$ hours | 68 | 4 | 38 | 145 | 174 | 285 |
|  | $\geq 13$ hours | 13 | 0 | 1 | 14 | 43 | 239 |
|  | Long work week |  |  |  |  |  |  |
|  | $\geq 40$ hour | 31 | 24 | 32 | 40 | 44 | 52 |
|  | $\geq 48$ hours | 19 | 8 | 18 | 28 | 36 | 52 |
|  | 260 hours | 6 | 0 | 2 | 9 | 18 | 51 |
| Rotational Pattern | Any Rotation | 19 | 0 | 6 | 39 | 53 | 201 |
| Direction | Forward | 6 | 0 | 1 | 6 | 21 | 118 |
|  | Backward | 5 | 0 | 1 | 5 | 16 | 126 |
|  | Flipped | 8 | 0 | 0 | 2 | 43 | 82 |
| Social Aspects | Weekend shift | 41 | 21 | 45 | 56 | 70 | 125 |

Abbreviations: P25 25th Percentile, P75 75th Percentile, P90 90th Percentile. Refer to Appendix Table 1 for specific definitions for each working hour characteristic.
*Max exceeds 365 or 366 days/year in a leap year and 105 weekends per year due to split shifts (multiple shifts a day).
cohort 2003－2014，USA（ N shifts＝22，443，533）

| Working Hour Characteristic |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Shift Type |  |  |  | Intensity |  |  | Duration |  |  |  |  |  |  | Rotation Pattern |  |  |  |  | Social Aspects |  |
|  | Morning | Day | Evening | Night | $\begin{aligned} & \text { Non- } \\ & \text { quick } \\ & \text { queturn } \end{aligned}$ | Quickreturn | $\begin{aligned} & \text { Very } \\ & \text { quick } \\ & \text { return } \end{aligned}$ | Shift |  |  | Week |  |  |  | No Rotation | Rotation | ForwardRotation | Backward Rotation | Flipped Rotation | Weekday | Weekend |
|  |  |  |  |  |  |  |  | $\begin{aligned} & \stackrel{<12}{\text { hours }} \end{aligned}$ | $\underset{\text { hours }}{\text { H2 }}$ | $\underset{\text { hours }}{\text { ho }}$ | $\begin{aligned} & <40 \\ & \text { hours } \end{aligned}$ | $240$ | $\begin{aligned} & z 48 \\ & \text { hours } \end{aligned}$ | $\begin{aligned} & \text { 又60 } \\ & \text { hours } \end{aligned}$ |  |  |  |  |  |  |  |
| $\underset{\text { All }}{\text { persons }}$ | 5.5 | 50.2 | 16.2 | 28.1 | 95.0 | 5.2 | 1.8 | 70.1 | 29.9 | 5.56 | 86.6 | 13.4 | 8.1 | 2.6 | 91.4 | 8.6 | 2.8 | 2.2 | 3.5 | 82.2 | 17.8 |
| Gender | 完 |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| Female | 6.8 | 46.5 | 18.9 | 27.8 | 97.5 | 2.5 | 0.9 | 86.3 | 13.8 | 1.8 | 90.3 | 9.8 | 4.6 | 1.0 | 95.3 | 4.7 | 2.0 | 1.7 | 1.1 | 84.9 | 15.1 |
| Male | 5.2 呍 | 51.0 | 15.6 | 28.2 | 94.2 | 5.8 | 1.9 | 66.9 | 33.1 | 6.3 | 89.4 | 10.6 | 6.5 | 2.2 | 90.7 | 9.3 | 3.0 | 2.3 | 4.0 | 81.6 | 18.4 |
| Race | － |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| AI／AN | 9.3 ． | 48.8 | 13.4 | 28.6 | 94.7 | 5.3 | 1.8 | 59.4 | 40.6 | 5.8 | 88.0 | 12.0 | 7.3 | 2.6 | 91.5 | 8.5 | 1.5 | 1.3 | 5.8 | 82.2 | 17.9 |
| $\begin{aligned} & \text { Asian/N } \\ & \text { H/OPI } \end{aligned}$ | $5.2{ }^{\text {c／}}$ | 39.7 | 24.4 | 30.7 | 95.7 | 4.3 | 1.3 | 76.2 | 23.8 | 2.8 | 89.8 | 10.2 | 6.0 | 2.0 | 94.1 | 5.9 | 2.3 | 1.7 | 1.9 | 82.3 | 17.7 |
| ${ }^{\text {Black/A }}$ | 5.1 | 43.6 | 17.8 | 33.5 | 95.8 | 4.2 | 1.3 | 71.2 | 28.8 | 4.0 | 90.3 | 9.7 | 5.5 | 1.7 | 90.3 | 9.7 | 2.9 | 2.3 | 4.5 | 81.1 | 18.9 |
| $\begin{gathered} \text { Hispanic } \\ \text { or Latino } \end{gathered}$ | $9.4$ | 41.4 | 16.6 | 32.6 | 96.2 | 3.8 | 1.4 | 66.8 | 33.2 | 3.3 | 88.2 | 11.8 | 7.2 | 2.3 | 92.9 | 7.2 | 1.9 | 1.4 | 3.9 | 81.9 | 18.1 |
| $\underset{\text { Multi- }}{\text { Macial }}$ |  | 40.9 | 21.4 | 35.0 | 95.5 | 4.5 | 1.3 | 68.4 | 31.6 | 4.2 | 88.5 | 11.5 | 6.2 | 1.1 | 91.0 | 9.1 | 3.3 | 2.3 | 3.5 | 80.8 | 19.2 |
| White | 5.2 | 52.4 | 15.7 | 26.8 | 94.5 | 5.5 | 1.9 | 70.1 | 29.9 | 6.1 | 89.5 | 10.5 | 6.2 | 2.1 | 91.5 | 8.5 | 2.9 | 2.3 | 3.4 | 82.4 | 17.6 |
| Age |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| $\begin{aligned} & 18-30<30 \\ & \text { years } \end{aligned}$ | 3.8 | 37.2 | 18.6 | 40.4 | 96.0 | 4.0 | 1.1 | 58.7 | 41.3 | 4.6 | 89.8 | 10.2 | 5.9 | 1.9 | 89.3 | 10.7 | 2.7 | 1.8 | 6.2 | 80.0 | 20.0 |
| $\begin{aligned} & 30<40 \\ & \text { years } \end{aligned}$ | 4.0 | 43.9 | 15.7 | 36.5 | 95.0 | 4.9 | 1.7 | 61.8 | 38.2 | 5.6 | 89.4 | 10.6 | 6.4 | 2.0 | 89.6 | 10.4 | 3.1 | 2.3 | 5.0 | 80.9 | 19.1 |
| $\begin{aligned} & 40-50 \\ & \text { years } \end{aligned}$ | 4.7 | 49.9 | 15.9 | 29.5 | 94.8 | 5.2 | 1.8 | 69.0 | 31.0 | 5.5 | 89.7 | 10.3 | 6.2 | 2.0 | 91.2 | 8.8 | 3.0 | 2.6 | 3.5 | 82.3 | 17.7 |
| $\begin{gathered} 50-60 \\ \text { years } \end{gathered}$ | 6.5 | 55.3 | 15.9 | 22.3 | 94.4 | 5.6 | 1.9 | 75.1 | 24.9 | 5.9 | 89.4 | 10.6 | 6.2 | 2.1 | 92.5 | 7.6 | 2.7 | 2.2 | 2.7 | 82.9 | 17.1 |


|  | Working Hour Characteristic |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Shift Type |  |  |  | Intensity |  |  | Duration |  |  |  |  |  |  | Rotation Pattern |  |  |  |  | Social Aspects |  |
|  | Morning | Day | Evening | Night | Nonquick return | Quick return | Very quick return | Shift |  |  | Week |  |  |  | No <br> Rotation | Rotation | Forward Rotation | Backward Rotation | Flipped Rotation | Weekday | Weekend |
|  |  |  |  |  |  |  |  | $\begin{aligned} & <12 \\ & \text { hours } \end{aligned}$ | $\begin{aligned} & \geq 12 \\ & \text { hours } \end{aligned}$ | $\geq 13$ hours | <40 hours | $\begin{aligned} & \geq 40 \\ & \text { hours } \end{aligned}$ | $\begin{aligned} & \geq 48 \\ & \text { hours } \end{aligned}$ | $\begin{aligned} & \nsucc 0 \\ & \text { hours } \end{aligned}$ |  |  |  |  |  |  |  |
| $\begin{array}{r} 60+ \\ \text { years } \end{array}$ | 8.0 | 54.4 | 17.2 | 20.4 | 94.7 | 5.4 | 2.1 | 79.5 | 20.5 | 5.4 | 89.4 | 10.6 | 6.3 | 2.3 | 93.7 | 6.4 | 2.3 | 2.0 | 2.0 | 83.5 | 16.6 |
| Most shift domain catemories are not mutually exclusive and marginal totals of shift domains will not sum to $100 \%$. <br> Within each cell, colunक्प्रs are the numerator, rows are the denominator. Therefore, the number in the first row and first column states $5.5 \%$ of all shifts are morning shifts. Refer to Appendix Table 1 for specific definitions for each working time characteristic. <br> Abbreviations: AI/AN A. American Indian or Alaska Native; NP/OPI Native Hawaiian or Other Pacific Islander; AA African American |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |

e of Shifts in a Year by each Working Hour Characteristic Stratified by Person－year Shift Schedules in the American Manufacturing Cohort plant cohort 2003－2014，USA（ $\mathrm{N}=98,771$ person－years）

|  | Working Hour Characteristic |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Shift Type |  |  |  | Intensity |  |  | Duration |  |  |  |  |  |  | Rotation Pattern |  |  |  |  | Social Aspects |  |
|  | Morning | Day | Evening | Night | Non－ quick return | Quick return | Very quick return | Shift |  |  | Week |  |  |  | No <br> Rotation | Rotation | Forward Rotation | Backward Rotation | Flipped Rotation | Weekday | Weekend |
|  |  |  |  |  |  |  |  | $\begin{aligned} & <12 \\ & \text { hours } \end{aligned}$ | $\begin{aligned} & \geq 12 \\ & \text { hours } \end{aligned}$ | $\begin{aligned} & \geq 13 \\ & \text { hours } \end{aligned}$ | $<40$ hours | $\geq 40$ hours | $\begin{aligned} & \geq 48 \\ & \text { hours } \end{aligned}$ | $\begin{aligned} & \mathbf{Z 6 0} \\ & \text { hours } \end{aligned}$ |  |  |  |  |  |  |  |
| Permanent Day | $11.2$ | 87.4 | 0.7 | 0.7 | 98.6 | 1.4 | 0.4 | 80.8 | 19.2 | 1.5 | 90.9 | 9.1 | 4.7 | 1.1 | 99.2 | 0.8 | 0.4 | 0.4 | 0.1 | 87.7 | 12.3 |
| Permanent Evening | $0.04 \underset{\text { 号 }}{\stackrel{\text { B }}{2}}$ | 2.5 | 95.7 | 1.5 | 96.6 | 3.4 | 1.5 | 93.9 | 6.1 | 3.3 | 90.8 | 9.2 | 3.9 | 0.9 | 94.7 | 5.3 | 2.7 | 2.7 | 0.02 | 86.0 | 14.0 |
| Permanent Night | $0.2 \text { 烒 }$ | 1.0 | 0.9 | 98.0 | 96 | 4.0 | 1.5 | 70.2 | 29.8 | 4.3 | 89.0 | 11.1 | 7.1 | 2.4 | 96.0 | 4.0 | 1.8 | 1.9 | 0.2 | 76.4 | 23.6 |
| Day／ Evening | $2.7 \text { 鱼葛 }$ | 51.7 | 44.0 | 1.6 | 89.7 | 10.4 | 3.7 | 85.0 | 15.0 | 9.2 | 90.2 | 9.9 | 5.7 | 1.9 | 93.3 | 6.7 | 3.2 | 3.3 | 0.2 | 86.1 | 13.9 |
| Day／Night | 6.0 式 | 48.5 | 1.4 | 44.1 | 95.5 | 4.6 | 1.4 | 39.6 | 60.4 | 6.4 | 88.5 | 11.5 | 7.2 | 2.7 | 83.1 | 16.9 | 1.8 | 1.8 | 13.4 | 77.4 | 22.6 |
| Evening／ Night | $1.5 \stackrel{\frac{\sigma}{\theta}}{\underset{0}{0}}$ | 2.3 | 55.9 | 41.8 | 93.0 | 7.0 | 2.4 | 77.3 | 22.7 | 6.9 | 89.6 | 10.4 | 6.0 | 2.0 | 92.2 | 7.8 | 3.7 | 3.8 | 0.3 | 81.4 | 18.6 |
| Day／ Evening／ Night | $1.2 \text { N }$ | 36.1 | 30.7 | 31.8 | 88.3 | 11.7 | 4.1 | 74.4 | 25.6 | 11.8 | 89.4 | 10.6 | 6.6 | 2.6 | 81.0 | 19.0 | 10.4 | 6.0 | 2.6 | 78.1 | 22.0 |
| main categor |  | ually | clusive an | margin | totals o | shift doma | ains will | ot sum to | $100 \% \text {. }$ |  |  |  |  |  |  |  |  |  |  |  |  |

Joint Distributions (\%) of Working Hour Characteristics in American Manufacturing Cohort (AMC), 51 Plant Shift Work Cohort 2003-2014, USA (N shifts=22,443,533)

| Working Hour Characteristic |  | Shift Type |  |  |  | Intensity |  |  | Duration |  |  | Rotation Pattern |  |  |  |  | Social Aspects |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | Morning | Day | Evening | Night | NonShort Return | Quick <br> Return | Very Quick Return | $\begin{aligned} & \text { Shift } \\ & <12 \end{aligned}$ <br> Hours | $\begin{aligned} & \text { Shift } \\ & \geq 12 \\ & \text { Hours } \end{aligned}$ | Shift $\geq 13$ <br> Hours | No <br> Rotation | Rotation | Forward <br> Rotation | Backward Rotation | Flipped <br> Rotation | Weekday | Weekend |
| ${ }^{\text {All Shifts }}$ |  | 5.5 | 50.2 | 16.2 | 28.1 | 95.0 | 5.2 | 1.8 | 70.1 | 29.9 | 5.56 | 91.4 | 8.6 | 2.8 | 2.2 | 3.5 | 82.2 | 17.8 |
| $\begin{aligned} & \text { S. Shift } \\ & \text { O. Type } \end{aligned}$ | Morning | 100 | - | - | - | 95.4 | 4.6 | 0.9 | 70.6 | 29.4 | 5.4 | 96.8 | 3.2 | 0.9 | 0.8 | 1.5 | 79.5 | 20.5 |
|  | Day | - | 100 | - | - | 96.4 | 3.6 | 1.3 | 76.1 | 23.9 | 0.7 | 93.8 | 6.2 | 1.7 | 1.2 | 3.2 | 85.0 | 15.0 |
|  | Evening | - | - | 100 | - | 93.0 | 7.0 | 2.4 | 82.8 | 17.2 | 13.6 | 89.6 | 10.4 | 6.5 | 3.1 | 0.8 | 85.9 | 14.1 |
|  | Night | - | - | - | 100 | 92.8 | 7.2 | 2.5 | 51.8 | 48.2 | 9.6 | 87.2 | 12.8 | 3.0 | 3.7 | 6.1 | 75.5 | 24.5 |
|  | Nonshort return | 5.5 | 51.1 | 15.9 | 27.5 | 100 | - | - | 71.2 | 28.8 | 3.5 | 92.4 | 7.6 | 3.0 | 0.9 | 3.7 | 82.3 | 17.7 |
|  | Quick return | 4.9 | 34.5 | 21.7 | 38.9 | - | 100 |  | 48.8 | 51.2 | 41.9 | 73.3 | 26.8 | 0.02 | 26.3 | 0.4 | 79.4 | 20.6 |
|  | Very quick return | 2.8 | 35.7 | 21.9 | 39.6 | - | 100 | 100 | 53.6 | 46.4 | 38.3 | 68.0 | 32.1 | 0.1 | 31.5 | 0.5 | 79.9 | 20.1 |
|  | Shift < 12 <br> hours | 5.2 | 54.6 | 19.1 | 20.8 | 96.4 | 3.6 | 1.4 | 100 | - | - | 94.3 | 5.8 | 3.5 | 1.7 | 0.6 | 84.9 | 15.2 |
|  | Shift $\geq 12$ <br> hours | 5.4 | 40.1 | 9.3 | 45.3 | 91.1 | 8.9 | 2.7 | - | 100 | 18.6 | 84.9 | 15.2 | 1.2 | 3.5 | 10.5 | 75.9 | 24.1 |
|  | Shift $\geq$ 13 hours | 5.3 | 6.4 | 39.7 | 48.6 | 60.6 | 39.4 | 12.2 | - | 100 | 100 | 75.2 | 24.8 | 4.5 | 16.3 | 4.0 | 81.4 | 18.6 |
| Rotation Pattern | No rotation | 5.8 | 51.5 | 15.8 | 26.8 | 95.8 | 4.2 | 1.3 | 72.2 | 27.8 | 4.6 | 100 | - | - | - | - | 82.2 | 17.8 |
|  | Rotation | 2.1 | 36.4 | 19.6 | 41.9 | 83.7 | 16.3 | 6.6 | 47.0 | 53.0 | 16.1 | - | 100 | 32.7 | 25.9 | 41.4 | 81.3 | 18.7 |
|  | Forward rotation | 1.7 | 31.2 | 37.2 | 30.0 | 99.9 | 0.04 | 0.04 | 87.5 | 12.6 | 8.9 | - | 100 | 100 | - | - | 78.3 | 21.7 |
|  | Backward rotation | 2.1 | 27.9 | 22.7 | 47.3 | 37.9 | 62.1 | 25.1 | 52.4 | 47.6 | 40.7 | - | 100 | - | 100 | - | 71.2 | 28.8 |


| Working Hour Characteristic |  | Shift Type |  |  |  | Intensity |  |  | Duration |  |  | Rotation Pattern |  |  |  |  | Social Aspects |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | Morning | Day | Evening | Night | NonShort Return | Quick <br> Return | Very Quick Return | $\begin{aligned} & \text { Shift } \\ & <12 \\ & \text { Hours } \end{aligned}$ | Shift $\geq 12$ <br> Hours | Shift $\geq 13$ <br> Hours | No <br> Rotation | Rotation | Forward <br> Rotation | Backward Rotation | Flipped Rotation | Weekday | Weekend |
|  | Flipped rotation | 2.4 | 45.9 | 3.7 | 48.0 | 99.4 | 0.6 | 0.3 | 11.7 | 88.3 | 6.3 | - | 100 | - | - | 100 | 90.0 | 10.0 |
| Social Aspects | Weekday | 5.3 | 52.0 | 16.9 | 25.9 | 95.0 | 5.1 | 1.7 | 72.4 | 27.7 | 5.5 | 91.5 | 8.5 | 2.7 | 1.9 | 3.9 | 100 | - |
|  | Weekend | 6.3 | 42.3 | 12.8 | 38.6 | 94.0 | 6.0 | 2.0 | 59.5 | 40.5 | 5.8 | 91.0 | 8.6 | 3.4 | 3.6 | 2.0 | - | 100 |

ithin each domain, columns are the numerator, rows are the denominator. Therefore, the number in the first row and first column states $5.5 \%$ of all shifts are morning shifts.
Birshes (-) are used when the shift domain definitions are mutually exclusive; to reflect a structural zero. Refer to Appendix Table 1 for specific definitions for each working time characteristic.


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    M.R.C was instrumental in the acquisition of the data and framing of the research question, and reviewed and edited the final manuscript
    D.R was instrumental in data preparation, and reviewed and edited the final manuscript.

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