Predictors of repeated sick leave in the workplace because of mental disorders

Mitsuhiro Sado¹
Joichiro Shirahase¹
Kimio Yoshimura²
Yuki Miura¹
Kazuhiro Yamamoto¹
Hajime Tabuchi¹
Motoichiro Kato¹
Masaru Mimura¹

¹Department of Neuropsychiatry, Keio University School of Medicine, Shinjuku-ku, Tokyo, Japan; ²Department of Health Policy and Management, Keio University School of Medicine, Shinjuku-ku, Tokyo, Japan

Introduction: Mental disorders create a considerable burden to society. Previous studies have shown that productivity loss constitutes the largest proportion of the total societal burden. For depression and anxiety disorders, in particular, more than half of the associated productivity loss occurs in the workplace. Many previous studies have clarified the risk factors for the relapse/recurrence of mental disorders in health care settings. However, the risk factors for repeated sick leave among mental disorders prevalent in the workplace have not yet been adequately evaluated.

Objective: The objective of this study was to investigate which variables could predict repeated sick leave for workers with a history of sick leave because of mental disorders.

Methods: Data regarding 194 subjects employed at a manufacturing company were obtained. Mental disorders were defined as disorders listed in the Diagnostic and Statistical Manual of Mental Disorders, fourth edition (DSM-IV). The duration between the return to work (RTW) and the repeated sick leave was regarded as a dependent variable. The subjects' age at the RTW, sex, age at the time of employment, job tenure, diagnosis, number of previous sick leave days, duration of most recent sick leave, and employee rank were examined as explanatory variables. Univariate analyses using a log-rank test and a multivariate analysis using the Cox proportional hazard model were conducted.

Results: The results of the univariate analyses showed that the number of previous sick-leave episodes was a significant predictor of repeated sick leave. A multivariate analysis revealed that age at RTW and the number of previous sick-leave episodes were significant variables.

Conclusion: Age and the number of previous sick-leave episodes appeared to be predictors of repeated sick leave. Therefore, effective intervention to prevent repeated sick leave for those with high risk is quite crucial. Analyses including various work-related factors with subjects from multiple companies should be conducted in future studies.

Keywords: sickness absence, occupational mental health, relapse/recurrence

Introduction

Mental disorders create a considerable burden to society. The Global Burden of Disease study¹ reported that mental and behavioral disorders constitute 7.4% of the societal burden incurred by all diseases. In many developed countries, productivity loss because of mental disorders has become a considerable issue.²⁻⁶ In the UK, mental disorders are reportedly the cause of 40% of all sick leave.² In Japan as well, the costs of productivity loss attributable to mental disorders are enormous. Productivity loss (ie, absenteeism/presenteeism, unemployment costs, and mortality cost) associated with schizophrenia, depression, and anxiety disorders has been estimated at JPY 2.0 trillion (USD 17 billion), JPY 2.9 trillion (USD 25 billion), and JPY 2.3 trillion (USD 20 billion),...
It is important to consider the role of mental disorders in workplace productivity loss. The objective of this study was to evaluate which variables are capable of predicting the risk of repeated sick leave among workers with a history of sick leave because of a mental disorder.

Methods

Design

This was a retrospective cohort study.

Subjects

Data were obtained from a manufacturing company in Japan, where approximately 10,000 people were employed in the Tokyo metropolitan area, and 81% of them were male. Data from employees were included in the analyses if they had returned to work between April 1, 2009, and March 31, 2012, after taking sick leave that had lasted longer than 20 days and that had been necessitated by a mental disorder. A cutoff point of 20 days was adopted, because according to the company’s regulations, employees who require sick leave lasting longer than 20 days must undergo an assessment by an occupational psychiatrist to determine whether they are mentally fit to return to work. Mental disorders were defined as the disorders listed in the Diagnostic and Statistical Manual of Mental Disorders, fourth edition (DSM-IV). Participants who took sick leave because of both physical and mental disorders were included in the analyses only when the main reason for the sick leave was judged by an occupational psychiatrist to be a mental disorder.

Clinical diagnoses coded according to the DSM-IV criteria were made clinically without any structured clinical interview by a senior psychiatrist, who had reviewed information from psychotherapists and interviews with the subjects, their coworkers, and personnel in the company’s human resource division. The diagnosis affecting the most recent sick leave was recorded as the primary diagnosis and was used for the analyses.

Process for returning to work

Once the subjects submitted a medical certificate to the human resource division for returning to work, they were referred to the occupational mental health support team. The employees participated in a brief rehabilitation program provided by psychotherapists that contained components of cognitive behavior therapy, such as behavior activation, activity records, and case formulation. Typically, after completing four sessions of the abovementioned interventions,
the employees were evaluated by a psychiatrist to determine whether they were fit to return to work. If the subject was judged to be fit to return to work, they were allowed to do so with some restrictions on their activities. These restrictions were removed in a step-by-step manner until they had been completely removed after 6 months.

Variables

Dependent variable
The duration between the return to work (RTW) and the repeated sick leave was regarded as a dependent variable. RTW was defined as the start of full-time work after sick leave lasting longer than 20 days and necessitated by a mental disorder, while repeated sick leave was defined as the restart of sick leave lasting longer than 20 days and necessitated by a mental disorder.

Explanatory variables
Because RTW is a multifactorial outcome, obtaining a wide range of data for specific variables across various diagnostic, sociodemographic, work-related, and personality parameters is essential. On the other hand, for daily occupational mental health activities, obtaining extensive data, for example through structured interviews for all employees undergoing an RTW is unrealistic. Therefore, we instead focused on variables that could be reasonably obtained during typical RTW assistance so as to assess whether such “easy to obtain” variables can be used to predict repeated sick leave.

We divided the explanatory variables into three categories: sociodemographic, diagnostic, and work-related. Further details of each category are given below.

Sociodemographic factors
Age at RTW, sex, age at employment of this company, and job tenure were examined as explanatory variables.

Diagnostic factors
Diagnosis, the number of previous sick-leave episodes, and the duration of the latest sick leave were examined.

Work-related factors
Employee rank at RTW was defined as being a work-related factor. Employee rank fell into four categories as follows: assistant staff, normal staff, senior staff, and manager. Employee ranks were strongly correlated to the job role at the company. Typical job roles for each employee rank are described below.

Assistant staff
The expected job roles of assistant staff were to support and help other employees work efficiently by collecting data or making presentation slides, for example.

Normal staff
The job roles of normal staff are to conduct tasks assigned by the senior staff. Although these employees occasionally need to collaborate with colleagues, they mainly conduct tasks on an individual basis.

Senior staff
Senior staff are expected to act as team leaders; a team typically consists of a small number of normal staff members. A team leader’s mission is to manage the team so as to complete the tasks assigned by a manager.

Manager
Managers operate projects by managing several teams. Their main roles are to provide team leaders with missions and to control the progress of projects.

Analysis
As previously mentioned, factors capable of predicting repeated sick leave were assessed by conducting a log-rank test and Cox proportional hazard analyses. The dependent variable (the number of days until the repeated sick leave) was censored when participants were still working as of March 31, 2012, or had retired, or were transferred outside of the Tokyo metropolitan branch facility.

First, univariate analyses were conducted. Each explanatory variable was assessed using a log-rank test. In order to conduct log-rank test, all variables were categorized as shown in Table 1. Next, all the explanatory variables were inputted into the model, and a multivariate analysis was performed using the Cox proportional hazard model with stepwise variable selection. The predictor variables sex and age at RTW were forced into the model, and all the other variables were selected using the stepwise method. In the process of multivariate analysis, variables such as sex, the number of previous sick-leave episodes, diagnosis, and employee rank were treated as categorical variables, while others were imputed as continuous variables.

With regard to the number of prior sick-leave episodes, because the results of prior study showed that there was huge discrepancy in survival rate between two and three episodes, we decided to divide this variable between them. In the multivariate analysis, the hazard ratios of explanatory variables were presented compared with the reference category,
the ratio of which was 1. A hazard ratio larger than 1 indicated that the risk of sick leave was larger than that of the reference category. These analyses were conducted using SPSS (SPSS Inc, Chicago, IL, USA) for Windows, version 17.

Ethical considerations
To conduct the analyses, we secondarily utilized data that had already been obtained through the normal RTW process. Thus, it was difficult to obtain informed consent retrospectively from the employees who had participated in the RTW process. Since only anonymous data were used, we judged it to be unnecessary to obtain informed consent from the employees. This study was approved by the Clinical Research Ethics Committee of Keio University School of Medicine.

Results
Subject characteristics
Sociodemographic variables
The total number of subjects included in the analysis was 194; of those, 159 subjects were male and 35 were female. The study subjects ranged in age from 24 to 59 years, with a mean age ± standard deviation (SD) of 38.4 ± 7.0 years. The subjects were stratified according to age category. The 30–39-year age group was the largest, followed by the 40–49-year and the 20–29-year age groups.

Diagnostic variables
Overall, 100 subjects (51.5%) were diagnosed as having major depressive disorders, 55 (28.4%) were diagnosed as having adjustment disorders, 15 (7.7%) were diagnosed as having bipolar disorders, 7 (3.3%) were diagnosed as having anxiety disorders, and 4 (2.1%) were diagnosed as having schizophrenia. Other diagnoses included personality disorders, substance related disorders, somatoform disorders, eating disorders, pervasive development disorders, attention-deficit and disruptive behavior disorders, and unspecific mental disorders. Overall, 122 subjects (62.6%) had experienced one previous sick-leave episode, 46 (23.6%) had experienced two episodes, 14 (7.2%) had experienced three episodes, six (3.0%) had experienced four episodes, five (2.6%) had experienced five episodes, and one (0.5%) had experienced six episodes. The mean duration of the latest sick leave ± SD was 352.6±354.3 days, and 29 subjects (14.9%) had suffered repeated sick leave after RTW during the observational period (April 1, 2009, to March 31, 2012). The detailed characteristics of the subjects are shown in Table 1.

Table 1 Characteristics of the subjects (n=194)

<table>
<thead>
<tr>
<th>Predictor</th>
<th>n</th>
<th>%</th>
</tr>
</thead>
<tbody>
<tr>
<td><strong>Sociodemographic</strong></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Age at return to work (years)</td>
<td></td>
<td></td>
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<tr>
<td>20–29</td>
<td>20</td>
<td>10.3</td>
</tr>
<tr>
<td>30–39</td>
<td>90</td>
<td>46.4</td>
</tr>
<tr>
<td>40–49</td>
<td>72</td>
<td>37.1</td>
</tr>
<tr>
<td>≥50</td>
<td>12</td>
<td>6.2</td>
</tr>
<tr>
<td>Sex</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Male</td>
<td>159</td>
<td>82.0</td>
</tr>
<tr>
<td>Female</td>
<td>35</td>
<td>18.0</td>
</tr>
<tr>
<td>Age at initial employment (years)</td>
<td></td>
<td></td>
</tr>
<tr>
<td>&lt;1</td>
<td>88</td>
<td>45.4</td>
</tr>
<tr>
<td>25–29</td>
<td>80</td>
<td>41.2</td>
</tr>
<tr>
<td>30–34</td>
<td>18</td>
<td>9.3</td>
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<tr>
<td>35–39</td>
<td>6</td>
<td>3.1</td>
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<tr>
<td>40–50</td>
<td>2</td>
<td>1.0</td>
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<tr>
<td>Tenure (years)</td>
<td></td>
<td></td>
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<tr>
<td>&lt;5</td>
<td>28</td>
<td>14.4</td>
</tr>
<tr>
<td>5–9</td>
<td>54</td>
<td>27.8</td>
</tr>
<tr>
<td>10–19</td>
<td>78</td>
<td>40.2</td>
</tr>
<tr>
<td>≥20</td>
<td>34</td>
<td>17.5</td>
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<tr>
<td><strong>Diagnostic</strong></td>
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<tr>
<td>Number of previous sick-leave episodes</td>
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<td></td>
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<tr>
<td>&lt;3</td>
<td>168</td>
<td>86.6</td>
</tr>
<tr>
<td>≥3</td>
<td>26</td>
<td>13.4</td>
</tr>
<tr>
<td>Diagnosis</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Major depressive disorder</td>
<td>100</td>
<td>51.5</td>
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<tr>
<td>Adjustment disorder</td>
<td>55</td>
<td>28.4</td>
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<tr>
<td>Bipolar disorder</td>
<td>15</td>
<td>7.7</td>
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<tr>
<td>Anxiety disorder</td>
<td>7</td>
<td>3.6</td>
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<tr>
<td>Schizophrenia</td>
<td>4</td>
<td>2.1</td>
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<tr>
<td>Others</td>
<td>13</td>
<td>6.7</td>
</tr>
<tr>
<td>Duration of sick leave (days)</td>
<td></td>
<td></td>
</tr>
<tr>
<td>&lt;90</td>
<td>43</td>
<td>22.2</td>
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<tr>
<td>90–180</td>
<td>49</td>
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<td>181–365</td>
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<td>19.1</td>
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<tr>
<td>&gt;365</td>
<td>65</td>
<td>33.5</td>
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<tr>
<td><strong>Work related</strong></td>
<td></td>
<td></td>
</tr>
<tr>
<td>Employee rank</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Manager</td>
<td>33</td>
<td>17.0</td>
</tr>
<tr>
<td>Senior staff</td>
<td>102</td>
<td>52.6</td>
</tr>
<tr>
<td>Normal staff</td>
<td>55</td>
<td>28.4</td>
</tr>
<tr>
<td>Assistant staff</td>
<td>4</td>
<td>2.1</td>
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</tbody>
</table>

Univariate analyses
The results are shown in Table 2. Only the number of previous sick-leave episodes was significant (P<0.001).

Multivariate analyses
The result of model χ² test was significant (P<0.001). Among the variables that were examined, the age at RTW and the number of previous sick-leave episodes appeared to be significant. Regarding the age at RTW, the hazard ratio (95% CI) was 0.923 (0.866–0.984).
On the other hand, with respect to the number of previous sick-leave episodes, when two or fewer previous episodes were used as the reference level, the estimated hazard ratio increased from 1.00 for the reference to 4.83 for those with three or more episodes. The 95% CI was 2.19–10.64. Further details are shown in Table 3.

Log minus log graph was drawn in order to assess the adequacy of the Cox regression model with regard to the number of previous sick-leave episodes. Both curves ($\leq 2$ and $\geq 3$) appeared to be parallel. Therefore, we judged that the adequacy of this model was maintained.

**Discussion**

**Summary**

As previously mentioned, because a large proportion of societal costs arising from mental disorders are likely to occur in the workplace, preventing repeated sick leave because of relapse/recurrence is a significant issue. As far as we know,
this is the first study to evaluate the risk factors for repeated sick leave, not only from a diagnostic and demographic perspective but also from the perspective of work roles in a Japanese setting.

**Diagnostic variables**

Similar to the results of a previous study evaluating risk factors for relapse/recurrence, the number of previous sick-leave episodes was a strong predictor of repeated sick leave.

The present results indicated that subjects with more than three previous episodes were almost five times more likely to require repeated sick leave than those with one or two previous episodes. This result is consistent with the findings of previous studies, which showed that a larger number of previous episodes was associated with a higher risk of relapse/recurrence. On the other hand, previous studies have also implied that subclinical residual symptoms are another strong predictor. However, this parameter was not evaluated in the present study, because the subjects had different disorders, and the severity of the symptoms was difficult to measure using a single scale.

**Sociodemographic variables**

In the present study, a younger age was also a risk factor for repeated sick leave. This result is largely in accordance with the results of previous studies, which indicate that repeated sick leave because of CMDs is more common among younger subjects in studies conducted in the Netherlands. One possible explanation for this phenomenon is that the onset of mental illness at a younger age suggests a higher biological vulnerability for relapse or the recurrence of mental disorders. Another explanation might be the possibility of a selection bias, known as the “healthy workers effect.” Workers suffering from mental disorders often leave the workplace as their age increases.

Actually, the result of studies conducted under a health care setting suggests that the relationship between age and the recurrence of depression is questionable. Hardeveld showed that the number of studies suggesting a significant association between age and recurrence is actually quite small (n=2), compared with those that do not show a significant relationship (n=9).

Regarding gender, no difference in the risk of repeated sick leave was seen between men and women in the present study. A previous study also reported the same result. Another previous study, which evaluated risk factors for the recurrence of major depression through a systematic review, also concluded that gender was not a risk factor for the recurrence of major depression. Our findings seem to agree with the results of these previous studies. Interestingly, women are known to have a higher risk of the onset of a first depressive episode and to require sick leave because of a CMD. However, this gender difference disappeared when recurrence or repeated sick leave was considered. The reason for this distinction remains unclear and should be addressed in future studies.

**Work-related variables**

As far as the authors know, the relationship between the work role and repeated sick leave has not been adequately investigated. This is one of the unique points of the present study. Our results did not show any relationship between the work role and the risk of repeated sick leave. However, the study population included in the present analysis might have been too small to detect a significant difference. Therefore, caution is needed when interpreting the results.

In summary, taking into consideration the fact that those who are at younger age and have more than three previous sick-leave episodes are at high risk of repeated sick leave, effective intervention to prevent repeated sick leave for those with high risk is quite crucial.

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**Table 3 Predictors for repeated sick leave (multivariate analysis)**

<table>
<thead>
<tr>
<th>Predictor</th>
<th>β</th>
<th>SE</th>
<th>Wald</th>
<th>df</th>
<th>P</th>
<th>Hazard ratio</th>
<th>Hazard ratio</th>
</tr>
</thead>
<tbody>
<tr>
<td><strong>Sociodemographic</strong></td>
<td></td>
<td></td>
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<td></td>
<td></td>
</tr>
<tr>
<td>Age*</td>
<td>-0.080</td>
<td>0.033</td>
<td>5.993</td>
<td>1</td>
<td>0.014</td>
<td>0.923</td>
<td>0.866; 0.984</td>
</tr>
<tr>
<td>*<em>Sex</em></td>
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<td></td>
<td></td>
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<td></td>
</tr>
<tr>
<td>Male</td>
<td></td>
<td></td>
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<tr>
<td>Female</td>
<td>-0.534</td>
<td>0.565</td>
<td>0.895</td>
<td>1</td>
<td>0.344</td>
<td>0.586</td>
<td>0.194; 1.773</td>
</tr>
<tr>
<td><strong>Diagnostic</strong></td>
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<tr>
<td>Number of previous sick-leave episodes*</td>
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<td></td>
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<tr>
<td>≤2</td>
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<td></td>
<td></td>
<td></td>
<td>1.000</td>
<td>Reference</td>
</tr>
<tr>
<td>≥3</td>
<td>1.581</td>
<td>0.414</td>
<td>14.585</td>
<td>1</td>
<td>&lt;0.001</td>
<td>4.861</td>
<td>2.159; 10.943</td>
</tr>
</tbody>
</table>

**Notes:** *Analyzed using the forced entry method; **analyzed using the forward selection method (likelihood ratio).**

**Abbreviations:** SE, standard error; df, degrees of freedom.
Predictors of repeated sick leave because of mental disorders

Limitations
This study had some limitations, even though it presents significant knowledge. First, the study population was derived from a single company. Therefore, whether the results of this research are applicable to other companies or industries in Japan is still unclear. Second, all the subjects received specialized care from psychiatrists and psychotherapists before RTW. This care was relatively intense, compared with the typical assistance provided to employees who are RTW at a Japanese company. Thus, this intensive care might have reduced some risk factors for repeated sick leave. Third, diagnoses of the participants were made clinically without structured clinical interview. Therefore, the validation of diagnoses contains uncertainty to some degree. Fourth, the sample was relatively small in size and was derived from a single company. This might have biased the results to some extent. Finally, only a few work-related factors were evaluated, and other factors such as the work environment or interpersonal factors should be examined. Accordingly, these limitations should be carefully considered when interpreting the results of the present study, and future research should address these issues.

Conclusion
The present study investigated the predictors of repeated sick leave necessitated by mental disorders across multiple domains. The results showed that diagnostic (number of previous sick-leave episodes) and demographic (age) variables were predictors of repeated sick leave. Therefore, effective intervention to prevent repeated sick leave for those with high risk is quite crucial.

Further research examining various work-related factors and using subjects from multiple companies should be conducted in the future.

Author contributions
M Sado drafted the protocol under supervision of J Shirahase, K Yoshimura, H Tabuchi, M Kato, and M Mimura. Y Miura and K Yamamoto collected data and made a dataset for analyses. M Sado and K Yoshimura conducted the analyses and wrote the first draft of the article. J Shirahase, K Yoshimura, Y Miura, K Yamamoto, H Tabuchi, M Kato, and M Mimura commented upon the manuscript and provided feedback. All authors contributed toward data analysis, drafting and revising the manuscript. All authors read and approved the final version of protocol.

Disclosure
The authors declare that they have no competing interests in this work.

References