### ARTICLE





# Is admission to an SCI specialized rehabilitation facility associated with better functional outcomes? Analysis of data from the Thai Spinal Cord Injury Registry

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### Abstract

Study design Prospective cohort study of the Thai Spinal Cord Injury Registry.

**Objective** To determine whether being admitted to a spinal cord injury (SCI) specialized rehabilitation facility (SSRF) is associated with better functional outcomes.

Setting Four rehabilitation facilities in Thailand; one a SSRF and the others non-SSRFs.

**Methods** Data from the one SSRF and three non-SSRFs were extracted from the Thai Spinal Cord Injury Registry. Multivariate regression analysis was used to exclude the effect of confounding factors and prove the independent association of SSRF admission with respect to Spinal Cord Independence Measurement (SCIM) at discharge.

**Results** Among the 234 new SCI inpatients enrolled, 167 persons (71%) had been admitted to the SSRF. The SSRF had a greater proportion of persons with AIS A, B, C tetraplegia and people with AIS D, whereas the non-SSRFs had a higher proportion of patients with AIS A, B or C paraplegia. Patients discharged from the SSRF demonstrated a greater SCIM score improvement than those from the non-SSRFs (24.1 vs 17.0; p = 0.003). By using multivariate regression analysis controlling for age, time from injury to rehabilitation, severity of injury and SCIM score on admission, SSRF admission was found to be an independent predictive factor of SCIM score improvement at discharge (p = 0.008).

**Conclusion** Admission to an SSRF is associated with better rehabilitation outcomes. This finding supports the importance of SSRF access to improve the functional outcome of patients with SCI.

# Introduction

Spinal cord injury (SCI) potentially leads to impairment of bodily functions, resulting in limitation of activities and participation. The incidence of SCI varies worldwide, ranging from ten per million in the Netherlands to 83 per

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million in North America [1]. In Thailand, Kovindha et al. (1993) reported that the approximate incidence of SCI was 23 cases per million individuals [2]. The direct costs for the care of persons with SCI are staggering at a lifetime US\$ 1.1–4.6 million per person [1]. Although there have been major advances in understanding the pathophysiologic mechanisms of SCI, to date, a treatment resulting in significant neurologic recovery has not been found [3]. Therefore, a comprehensive medical rehabilitation program aimed to maximize functional recovery, remains the conventional management of SCI.

To evaluate the efficiency of SCI rehabilitation, a number of rehabilitation outcome measures have been introduced [4, 5]. Among these, the Spinal Cord Independence Measure (SCIM) is one of the most commonly used functional outcome measures in SCI [6]. SCIM is a well-developed, valid and reliable tool, specifically for people with SCI [7–9]. It was introduced in 1997, revised in 2002 [10, 11], with the latest version SCIM III published in 2007 [12]. The SCIM score ranges from 0 points, indicating complete dependence, to 100 points, indicating complete independence. The SCIM is used as a measure of rehabilitation outcomes, with a greater improvement of SCIM scores reflecting greater rehabilitation effectiveness. To evaluate the timedependent efficiency of the rehabilitation process, dividing SCIM improvement by length of stay (LOS) is proposed to represent rehabilitation efficiency [13].

Thailand, similar to most low-middle income countries [14-16], has no rehabilitation center solely dedicated to SCI rehabilitation [17]. Rehabilitation at Maharaj Nakorn Chiang Mai Hospital, a university hospital, is the only rehabilitation facility closest to a SCI specialized rehabilitation center, as determined by its 30-year history of continuous services and research dedicated to patients with SCI [17]. As SCI rehabilitation generally demands specialized knowledge and skills, with staff and leadership with SCIexpertise, it is reasonable to expect that admission to the SCI specialized rehabilitation facility (SSRF) should lead to better functional outcomes than admission to a non-SSRF. Previous evidence from Cheng et al. (2017) has demonstrated a significantly higher rate of return to home in rehabilitation than non-rehabilitation-participating SCI patients in Canada [18]. New et al. (2011) compared Functional Independence Measurement (FIM) at discharge between people with SCI admitted to a SSRF and non-SSRF in Australia [19], and found that those from an SSRF had significantly better FIM improvement than those from non-SSRF. However, this effect was only found in persons with non-traumatic SCI [19]. To the best of our knowledge, there has yet to be research published directly comparing rehabilitation effectiveness and efficiency of SSRFs and non SSRFs in a low-middle income country.

According to the literature, there are numerous factors that could affect functional independence [20, 21]. For example, Mamound et al. (2017) reported that tetraplegia and longer time from injury to rehabilitation admission had small but significant negative association with discharge FIM motor score [20]. Another study also demonstrated the negative association between time from injury to rehabilitation admission in traumatic SCI [22]. Age has been suggested to be a factor affecting functional independence after SCI. Although the effect of age on SCI rehabilitation outcome is inconsistent [23, 24], the tendency is an inverse effect [25]. Studies have also demonstrated that nontraumatic etiology had a negative effect on function improvement after rehabilitation [26, 27], although this effect was not demonstrated in another study [28]. Therefore, level of injury, severity of injury (determined by the American Spinal Injury Association Impairment Scale (AIS)), SCIM score on admission, time from injury to rehabilitation, age, and etiology of SCI (traumatic vs non-traumatic) can have a confounding effect on functional outcomes and need to be controlled.

The aim of this study was (1) to compare rehabilitation effectiveness of patients admitted for rehabilitation to SSRFs and non SSRFs and (2) to determine if there is an association between SSRF admission and improvement of functional outcomes. Our hypothesis was that (1) patients admitted to an SSRF have better rehabilitation outcomes than those from non SSRFs and (2) there is an independent association between admission to a SSRF and SCIM score improvement at discharge.

### Methods

### SCI and non-SCI specialized rehabilitation facilities

Data were obtained from the medical records of patients with SCI admitted into each of four tertiary rehabilitation facilities in Thailand: (1) Maharaj Nakorn Chiang Mai Hospital, Faculty of Medicine, Chiang Mai University, Chiang Mai Province; (2) Sirindhorn National Medical Rehabilitation Institute, Ministry of Health, Nonthaburi Province; (3) Ratchaburi Hospital, Ministry of Public Health, Ratchaburi Province; and (4) Siriraj Hospital, Faculty of Medicine Siriraj Hospital, Mahidol University, Bangkok. The percentage of SCI rehabilitation per total rehabilitation admission/the total number of rehabilitation beds/the number of SCI admission per year in the study period were 80/20/160 for Maharaj Nakorn Chiang Mai Hospital, 37/48/137 for Sirindhorn National Medical Rehabilitation Institute, 2.5/28/15 for Ratchaburi Hospital and 2.5/25/23 for Siriraj Hospital, respectively (these numbers include readmissions). Focusing on both the number of annual cases and concentration in SCI rehabilitation, we defined the criteria for SCI-specialized rehabilitation facilities (SSRFs) as (1) having more than 100 SCI rehabilitation admissions annually and (2) having SCI rehabilitation admissions greater than 60% of total rehabilitation admissions. Using these criteria, only Maharaj Nakorn Chiang Mai met the SSRF criteria, while the other three rehabilitation facilities were defined as non SSRFs.

### **Participants**

Both patients with traumatic and non-traumatic SCI were enrolled in this study. The inclusion criteria were (1) over 18 years of age; (2) first rehabilitation admission for SCI. The exclusion criteria were (1) admitted for the treatment of complications; (2) admitted for less than 5 days. The later criterion was used to exclude admissions that ended with incomplete rehabilitation programs.

	Overall	SCI specialized facility $(N=1)$	Non-SCI specialized facilities $(N=3)$	<i>p</i> -value
N (%)	234	167 (71)	67 (29)	-
Gender (M:F) (%)	155:79 (66:34)	110:57 (66:34)	45:22 (68:32)	0.850
Cause	169:65	119:48	50:17	0.633
Traumatic: Non-traumatic (%)	(72:28)	(71:29)	(75:25)	
Severity of injury				
C1-C4 Tetraplegia	56	33	3	< 0.001*
AIS A, B, C (%)	(25)	(20)	(4)	
C5-C8 Tetraplegia	32	18	14	
AIS A, B, C (%)	(14)	(11)	(21)	
Paraplegia	85	46	39	
AIS A, B, C (%)	(36)	(27)	(58)	
Tetraplegia and paraplegia	81	70	11	
AIS D (%)	(35)	(42)	(17)	
Age, years (SD)	48.5 (17.2)	50.6 (16.3)	43.1 (18.2)	0.004*
Time from injury to, rehabilitation admission, days				
Range	4-9121	4–9121	7–1187	< 0.001*
Median (IQR)	37 (125)	30 (35)	168 (398)	
Mean (SD)	199.4 (750)	166.5 (854)	288.1 (330)	
Length of stay, days				
Range	5-237	6–237	5-201	< 0.001*
Median (IQR)	41.5 (34)	46 (35)	30 (16)	
Mean (SD)	48.7 (32.5)	53.2 (33.1)	37.6 (28.1)	
SCIM score on admission				
Median (IQR)	25 (22)	23 (19)	27 (27)	0.241
Mean (SD)	29.3 (16.4)	28.2 (15.8)	31.1 (16.2)	
SCIM score at discharge				
Median (IQR)	51 (40)	53 (45)	48 (29)	0.171
Mean (SD)	51.6 (24.0)	52.7 (25.7)	48.1 (18.5)	
SCIM score improvement				
Median (IQR)	19 (28)	20 (29)	13 (18)	0.010*
Mean (SD)	22.0 (18.0)	24.1 (18.6)	17.0 (15.4)	
Rehabilitation efficiency				
Median (IQR)	0.5 (1.1)	0.6 (1.4)	0.4 (0.5)	0.029*
Mean (SD)	1.0 (1.1)	1.0 (1.2)	0.7 (0.9)	
N of patients with complications (%)	124 (53)	84 (50)	40 (60)	0.193
N of patients with UTI (%)	88 (38)	61 (37)	27 (40)	0.590
N of patients with pressure ulcer (%)	31 (13)	20 (12)	11 (16)	0.365
N of patients with VTE (%)	6 (3)	6 (4)	0 (0)	0.116
N of patients with postural hypotension (%)	6 (3)	3 (2)	3 (4)	0.241
N of patients with respiratory problems (%)	9 (4)	6 (4)	3 (4)	0.750
N of patients with musculoskeletal problems (%)	14 (6)	9 (5)	5 (7)	0.545
N of patients with psychiatric problems (%)	3 (1)	3 (2)	0 (0)	0.270

Table 1 Comparison of epidemiologic, outcome and complication parameters between the SCI specialized and the non-SCI specialized rehabilitation facilities

AIS American Spinal cord Injury Association (ASIA) Impairment Scale, SD standard deviation, SCIM spinal cord independence measure \*Significant level at p < 0.05 by using independent *t*-test; chi-square test; Mann–Whitney U test

### Study protocol

This study comprised a secondary analysis of the SCI registry study in Thailand. The study protocol was approved by the Institutional Ethics Committee of the Faculty of Medicine, Chiang Mai University, Chiang Mai, Thailand and was in accordance with the current version of the Helsinki Declaration. The research ID is 2880 and the study code is REH-2558–02880. The study was also approved by the local Ethics Committee of each rehabilitation facility. Persons with SCI were admitted to a rehabilitation facility according to the catchment area of the universal coverage public health system of Thailand, as well as the willingness of the patient. On admission, informed consent was obtained from each eligible

patient. Age, sex, level of injury (paraplegia/tetraplegia), AIS and LOS for rehabilitation were collected using the International Spinal Cord Injury core data set [29]. Time from injury to rehabilitation admission, the number of the days between injury date and rehabilitation admission date, were also calculated. Patients were classed into four groups according to the advisory guidelines of the International Spinal Cord Society (ISCoS): [30] (1) tetraplegia C1-C4 AIS A, B, C; (2) tetraplegia C5-C8 AIS A, B, C; (3) paraplegia AIS A, B, C; and (4) tetraplegia and paraplegia AIS D. Rehabilitation outcomes were collected using SCIM III [12]. The SCIM scores were obtained at least two times, on admission and at discharge. Rehabilitation effectiveness was calculated using the SCIM score improvement. Rehabilitation efficiency, which determines the change of rehabilitation outcome per one day of admission, was calculated using SCIM score improvement divided by LOS. Inpatient complications were also extracted.

### **Statistical analysis**

Categorical variables were described using percentages of frequency. Normally distributed numerical variables were described using arithmetic means and standard deviations. Non-normally distributed numerical variables were described using median and interquartile range. Differences of parameters between SSRFs and non SSRFs were compared using an independent *t*-test or Mann-Whitney U test, depending on the type of distribution. Multiple linear regression analysis, backward method, was applied to determine the independent effect of the studied parameters on SCIM score at discharge: age, etiology of SCI, time from injury to rehabilitation admission, severity of injury, SCIM score on admission, time between SCIM measurements, LOS and having been admitted to the SSRF were included as the predicting factors. Statistical analyses were performed using SPSS version 22.0 for Windows (SPSS Inc., Chicago, IL, USA). A p-value of less than 0.05 was considered statistically significant.

# Results

### **Demographic data**

Demographic data are presented in Table 1. Patients from the SSRF were significantly older than those from the non-SSRFs (50.6 vs 43.1 years old, p = 0.004; independent *t*-test). SSRF patients had significantly shorter time from injury to rehabilitation than non SSRF patients (30 vs 168 days, p < 0.001; Mann–Whitney U test). Significant differences in the level and severity of injury were observed between the two types of rehabilitation facilities (p < 0.001; chi-square test). The SSRF had significantly greater proportion of people with AIS D tetraplegia and paraplegia, while non SSRFs had significantly greater proportion of people with AIS A, B, C paraplegia (42 vs 17% and 27 vs 58%, respectively). Patients from the SSRF had significantly longer LOS than those from non SSRFs (53.2 days vs 37.6 days, p < 0.001; Mann–Whitney U test). No difference in ratio of traumatic and non-traumatic SCI between participants in SSRF and non-SSRF was observed (p = 0.632, chi-square test) (Table 1).

### **Rehabilitation outcomes**

No significant differences in SCIM scores at admission or at discharge were observed between the two types of rehabilitation facilities. Patients from the SSRF demonstrated greater improvement in SCIM scores than those from the non-SSRFs (24.1 vs 17.0, p = 0.01; Mann–Whitney U test). The rehabilitation efficiency, demonstrated by the improvement of the SCIM scores per day of admission, was also significantly greater in the SSRF compared with the non-SSRFs (Table 1).

### In-patient complication rates

No significant differences in terms of inpatient overall and individual complication rates, including the incidences of urinary tract infections, pressure ulcers, venous thromboembolism, postural hypotension, musculoskeletal, and respiratory and psychiatric complications, were observed (Table 1).

## Determining independent effect of the selected parameters on SCIM score at discharge using multivariate regression model

To avoid the non-linear effect of the continuous parameters, namely age, time from injury to rehabilitation admission, and LOS, we modified these parameters to ordinal dummy variables as per ISCOS recommendations [30]. Details of the modifications are presented in Table 2. Multiple linear regression analysis (backward method), demonstrated that age, severity of injury, admission SCIM, and SSRF admission were independent predictive factors of SCIM score at discharge. Factors of SCI etiology, time from injury to rehabilitation and LOS were not found to be independent predictive factors. Specifically, age had an unstandardized coefficient of -2.125 (Table 3). This result suggests that when all other independent variables are held constant, for each increasing age group, the SCIM score at discharge decreases by 2.1 points. Severity of injury on admission, defined as 0 when the patient was diagnosed with C1-C4 AIS A, B, C tetraplegia, 1 for C5-C8 AIS A, B, C tetraplegia, 2 for AIS A, B, C paraplegia, and 3 when the patient was diagnosed with AIS D tetraplegia or paraplegia, had an

unstandardized coefficient of 8.884 (Table 3). This result suggests that when all other independent variables are held constant, people with C5-C8 AIS A, B, C tetraplegia have 8.9 higher SCIM scores at discharge when compared to those with C1-C4 A, B, C tetraplegia; persons with A, B, C paraplegia have 8.9 higher SCIM scores at discharge compared to those with C5-C8 AIS A, B, C tetraplegia, and persons with AIS D have 8.9 higher SCIM scores at discharge when compared to AIS A, B, C paraplegia. SCIM scores on admission had an unstandardized coefficient of 0.699. (Table 3), suggesting that when all other independent variables are held constant, for each increase in SCIM score at admission, the SCIM score at discharge decreases by 0.7 points. Importantly, being admitted into an SSRF had an unstandardized coefficient of 6.836. (Table 3), which suggests that when all other independent variables are held constant, those admitted to an SSRF will have a 6.9 greater SCIM score improvement after rehabilitation that those admitted to a non-SSRF.

### Discussion

The major findings of this study are that the patients with SCI rehabilitated at the SSRF demonstrated significantly higher SCIM score improvement than those rehabilitated at

Table 2 Factors after contin	uous to ordinal modifications
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	Overall	SCI specialized facility $(N = 1)$		<i>p</i> -value
N	234	167	67	_
Age groups N	/ (%)			
18–30	48 (21)	27 (16)	21 (32)	0.051
31-45	43 (18)	29 (17)	14 (21)	
46-60	78 (33)	61 (37)	17 (25)	
61–75	55 (24)	41 (25)	14 (20)	
76 or more	10 (4)	9 (5)	1 (2)	
Time from in	jury to,reha	abilitation admissi	ion N (%)	
Less than one year	178 (76)	139 (83)	39 (58)	<0.001*
One year or more	56 (24)	28 (17)	28 (42)	
Length of sta	y N (%)			
Less than 30 days	76 (32)	41 (25)	35 (52)	<0.001*
31-60 days	100 (43)	75 (45)	25 (37)	
61–90 days	35 (15)	31 (18)	4 (6)	
91 days or more	23 (10)	20 (12)	3 (5)	

\*Significant level at p < 0.05 by using chi-square test

non-SSRFs. This finding corresponds with other studies, and demonstrates that admission to an SSRF was an independent positive factor of SCIM score improvement after rehabilitation, with a relatively high unstandardized coefficient (6.836). Since a clinically significant SCIM change is considered to be at least 4 points [31], the difference of SCIM score between SSRF and non-SSRF in this study has clinical importance. We also confirm the results from previous studies that age [25] and severity of injury [20, 21] have an independent effect on SCIM score improvement after the rehabilitation process. These results confirmed our hypotheses; however, the interpretation and application of this result must be carefully considered due to several interesting aspects.

First, the difference in the SCI characteristics may be responsible for the variation in rehabilitation outcomes. The SSRF had significantly greater proportion of people with AIS D tetraplegia and paraplegia than the non-SSRF, whereas non-SSRFs had greater ratio of people with AIS A. B, C paraplegia. People with AIS D tetraplegia, whose lower extremity motor scores should be better, have more capacity in mobility, whereas people with AIS A, B, C paraplegia, whose upper extremity motor scores should be better, have increased ability to perform self-care activities. The SCIM comprises 40 points in the mobility subscores but only 20 points in the self-care measures [12]. Therefore, patients from the SSRF, which contained a greater ratio of people with AIS D tetraplegia, had increased ability for improvement of their SCIM scores than those from non-SSRFs, which contained a greater ratio of people with AIS A, B, C paraplegia.

Next, our results are inconsistent with the previous results from the study of New et al. (2011), who demonsignificantly better functional improvements strated between SSRF and non- SSRF only in people with nontraumatic SCI [19]. Our findings may be due to the difference in the outcome measure used. In our study, we used SCIM score improvement, while the previous study used FIM score improvement as an indicator of rehabilitation effectiveness. Although both SCIM and FIM are functional measures, there are a number of differences in the details. Firstly, the SCIM has ten points possible for respiratory function, which can be improved in people with tetraplegia, but the FIM does not have this item. Secondly, although both SCIM and FIM have an item related to bladder function, the SCIM has more scoring options on management methods, such as indwelling catheterization, intermittent catherization, or voluntary voiding. Next, SCIM has more items on mobility function, such as mobility indoor, mobility for moderate distances and mobility outdoor, whereas FIM has only one item dedicated to locomotion [10, 32]. Since the SCIM is specifically made for evaluating the functional independence of people with SCI, we

Variables	В	SEB	β	<i>p</i> -value
Constant	31.414	8.158	-	<0.001*
Age (years)	-2.125	0.984	-0.103	0.032*
Time from injury to rehabilitation admission (days)	-4.301	2.983	-0.077	0.151
Being non-traumatic SCI $(0 = No; 1 = Yes)$	-2.733	2.686	-0.051	0.310
Length of stay (days)	-1.293	1.358	-0.050	0.342
Severity of injury $(0 = C1-4 \text{ AIS A}, B, C; 1 = C5-8 \text{ AIS A}, B, C; 2 = paraplegia AIS A, B, C; 3 = all AIS D)$	8.884	1.191	0.388	<0.001*
SCIM score on admission (/100 points)	0.699	0.082	0.466	< 0.001*
Being admitted in SCI-specialized rehabilitation facilities( $0 = No;$ 1 = Yes)	6.896	2.580	0.131	0.008*

*B* unstandardized regression coefficient, *SE* standard error of mean,  $\beta$  standardized regression coefficient, *SCI* spinal cord injury, *SCIM* spinal cord independence measure \*p < 0.05

propose that using the SCIM to evaluate rehabilitation effectiveness in persons with SCI is more reasonable than using FIM.

**Table 3** Summary of multiple linear regression analysis for determining SCIM score improvement ( $R^2 = 0.548$ )

In Thailand, there is no SCI rehabilitation center, and only one SSRF. This SSRF as described in this study is a tertiary level hospital. Among the three non-SSRFs, one is a tertiary public hospital, one is a general rehabilitation center and the other a university hospital. Notice that in this study, the number of the new patients recruited from the SSRF is 2.5 times more than those from the non-SSRFs. This difference may account for the better rehabilitation effectiveness in the SSRF, which has more SCI patients, resulting in more experience in caring for and rehabilitating patients with SCI. On the other hand, the complication rates in the SSRF were not different from those with shorter-admitted patients at the non-SSRFs, despite a longer LOS. This result may be due to both SSRF and non SSRFs being based in tertiary level hospitals, which have extensive experience in treating and preventing inpatient medical complications.

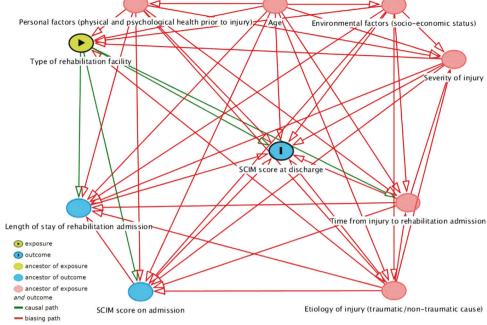
It is also worth noting that the rehabilitation efficiency was still greater in the SSRF than the non-SSRFs although the results of this study demonstrated a significant longer LOS of patients in the SSRF compared with patients in the non-SSRFs. As previously mentioned, rehabilitation efficiency is defined by functional improvement per day. This finding addresses the significant effect of SCIM score improvement that could dominate the difference in LOS. However, compared with previous studies from other countries [13, 33], the LOS for SCI rehabilitation (including the SSRF) in Thailand is relatively short due to limitations associated with the reimbursement process of the health care system in Thailand [34]. The LOS for neurological patients rehabilitated in Thailand is limited to 23 days [17]. This approach leads to admitting patients for longer than 23 days, which increases the cost without expanding the reimbursement. We suggest that the LOS in patients admitted to non SSRFs is too short to allow patients to achieve their expected SCIM scores and the system for reimbursement of medical rehabilitation in Thailand needs to be reconsidered.

Although this study is based on the largest SCI cohort in Thailand, it still has limitations. A major limitation in this study was that it potentially had a high risk from two types of biases, namely unmeasured confounding factors and unknown selection bias. Unmeasured confounding factors potentially included patients' socio-economic factors (environmental factors), as well as premorbid general physical and mental health status (personal factors). Both are called "contextual factors" according to the International Classification of Functioning, Disability and Health (ICF) framework. We suggest that a direct acyclic graph (DAG) identifying all associated factors by using the ICF Core Sets for individuals with SCI in the early post-acute context [35] might be used for conducting further cohort studies. An example of a DAG for this study is presented in Fig. 1. A DAG is a causal diagram presented by a graphic model that depicts a set of hypotheses about the causal process that generates a set of variables of interest. DAG is used to demonstrate the putative effect of a set of variables, called exposures, on another set of variables called outcomes. It can be used to identify confounding factors, which could affect both exposures and outcomes, called biases. One can study DAG in www.dagitty.net [36]. The selection bias was described by survivor bias due to differential mortality prior to admission. This might be due to the long time between SCI diagnosis and admission to first rehabilitation in combination with a potentially high mortality of SCI in lowmiddle income countries.

Another limitation in our study is that no psychological factors were determined. Thietje et al. (2010) reported that success in the parameters of emotion, energy or social status, is independent influencing factor of success in the parameter of functional status [37]. Finally, although often

Fig. 1 The theoretical paradigm for the further study using a direct acyclic graph model. The outcome was a rehabilitation outcome, which was SCIM score at discharge. The focusing exposure was having been admitted to a SCI specialized rehabilitation facility. The adjusted confounding factors were age, time from injury to rehabilitation admission, etiology of SCI, SCIM score on admission, severity of injury and length of stay. However, only age, time from injury to rehabilitation admission, etiology of SCI and severity of injury can influence both exposure and outcome, indicating potential biases. SCIM Spinal cord independence measure, SCI spinal cord injury

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used and easily collected, LOS may be the only surrogate outcome of the treatment time of rehabilitation program. It might be more representative to collect the exact treatment time across the disciplines of a rehabilitation program (e.g., the total duration of therapy throughout the entire admission time) rather than the LOS. However, such an approach may be more difficult to perform in this multicenter study.

In conclusion, the results of this Thailand-based, multicenter study demonstrated that admission to an SSRF may be associated with better rehabilitation outcomes. This result addresses the importance of having SSRF in lowmiddle income countries, including Thailand, to improve the rehabilitation outcomes of those with SCI. Studies to identify long-term rehabilitation outcomes, such as longterm readmission rate and family burden, are required to further demonstrate the importance of SSRF.

### **Data archiving**

The datasets generated and/or analyzed during the current study are available from the corresponding author on reasonable request.

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Author contributions SP was responsible for designing the research question, collecting and analyzing the data, drafting the manuscript and writing the final version of the manuscript. NK, RM, CC, and PK

were responsible for designing the research question, collecting the data and commenting on the final version of the manuscript. AK was responsible for designing the research question, collecting and analyzing the data and commenting on the final version of the manuscript.

### **Compliance with ethical standards**

Ethical approval The study protocol was approved by the Institutional Ethics Committee of the Faculty of Medicine, Chiang Mai University, Chiang Mai, Thailand and was in accordance with the current version of the Helsinki Declaration. The research ID is 2880 and the study code is REH-2558-02880. The study was also approved by the local Ethics Committee of Sirindhorn National Medical Rehabilitation Institute, Ratchaburi Hospital and Faculty of Medicine Siriraj Hospital Mahidol University. We certify that all applicable institutional and governmental regulations concerning the ethical use of human volunteers were followed during all course of this study.

Conflict of interest The authors declare that they have no conflict of interest.

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