

ARTICLE



Sex differences in urological management during spinal cord injury rehabilitation: results from a prospective multicenter longitudinal cohort study

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STUDY DESIGN: Prospective, multicenter, longitudinal cohort study.

OBJECTIVES: To describe female-male differences in first-line urological management during spinal cord injury (SCI) rehabilitation. **SETTING:** Inpatient specialized post-acute SCI rehabilitation in Switzerland.

METHODS: Data on bladder storage medication (antimuscarinic and beta-3 agonist) use, suprapubic catheter placement, demographic and SCI characteristics was collected within 40 days of SCI and at rehabilitation discharge from May 2013–September 2021. Prevalence and indicators of bladder storage medication and suprapubic catheter use at discharge were investigated with sex-stratified descriptive and logistic regression analyses.

RESULTS: In 748 patients (219 females, 29%), bladder storage medication use at discharge had a prevalence of 24% (95% CI: 18-29%) for females and 30% (95% CI: 26-34%) for males and was indicated by cervical AIS grade A, B, C and traumatic SCI in both sexes. Thoracic AIS grade A, B, C SCI (males), and lumbar/sacral AIS grade A, B, C SCI (females) predicted higher odds of bladder storage medication use (SCI characteristic*sex interaction, p < 0.01). Prevalence of suprapubic catheter use at discharge was 22% (95% CI: 17-28%) for females and 17% (95% CI: 14-20%) for males. Suprapubic catheter use was indicated by cervical AIS grade A, B, C SCI, and age >60 in both sexes. Females with thoracic grade A, B, C SCI tended to have higher odds of suprapubic catheter use (SCI characteristic*sex interaction, p = 0.013).

CONCLUSIONS: We identified sex differences in urological management especially in persons with AIS grade C or higher subcervical SCI. There is scope for well-powered, female-specific research in SCI in order to understand the underlying mechanisms and support patient-tailored management.

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INTRODUCTION

Women account for a growing proportion of the persons with acute spinal cord injury (SCI), especially in the oldest age groups [1-3]. In elderly populations, some of the dominant causes of SCI include low-level falls leading to traumatic SCI (TSCI) [1, 3, 4], and degenerative processes and diseases leading to non-traumatic SCI (NTSCI) [2, 3]. Although gender-specific considerations should be incorporated into most aspects of SCI management [5], they may particularly concern the urological domain, given the substantial physiological and anatomical differences in the lower urinary tract (LUT) between sexes [6]. Indeed, the neuro-urology guidelines do make female-specific recommendations in the cases where relevant evidence is present [7], but to this point, much of the urological research in SCI has been conducted in predominantly male populations [8], that are also often small and heterogeneous [9]. Following, when optimizing urological management, the transferability of majority-male results to the female SCI population is uncertain. The body of evidence addressing sex differences is even further limited in the context of management during inpatient post-acute SCI rehabilitation.

Two critical management issues in the context of SCI rehabilitation [10], potentially requiring a female-specific tailoring, include the use of antimuscarinic medications for neurogenic detrusor overactivity (NDO) and storage symptoms, as well as catheterization to promote complete bladder emptying. There is high-level evidence recommending the use of antimuscarinic medications as first-line treatment for patients with NDO [11, 12], but muscarinic receptor expression in the LUT has been shown to differ between the sexes, potentially resulting in differential responses to medications, and divergent management outcomes [13]. The evidence base regarding catheterization is more developed, there are reports that females are at higher risk than males for using an indwelling catheter at discharge from rehabilitation, as opposed to intermittent self-catheterization

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[14, 15]. The objective of this study is to describe differences in first-line LUT management between females and males during SCI rehabilitation in order to evaluate the scope for sex-specific research in neuro-urological management. The specific aims include: (1) to describe the prevalence of bladder storage medication and bladder emptying method stratified according to sex and SCI characteristics; (2) to evaluate whether predictors of bladder storage medication and suprapubic catheter use differ between sexes.

METHODS

Study design, setting, and participants

This study utilizes data from the prospective, longitudinal Swiss Spinal Cord Injury (SwiSCI) Inception Cohort, reported in detail elsewhere [16]. Participants were Swiss residents, age 16 or older, undergoing inpatient specialized post-acute SCI rehabilitation at one of the four specialized SCI centers in Switzerland from May 2013 to September 2021. Exclusion criteria were: acute SCI in the context of palliative care, SCI attributable to a congenital condition, or presence of a neurodegenerative disorder. During the study period, 49% consented to undergoing SwiSCI-specific data collection (study data set, SDS), 42% of the participants consented only to use of routine data from the clinical record, and 9% did not consent to any data collection. Data collection occurred at up to four time points during the inpatient rehabilitation stay: at discharge (0–15 days before discharge), and 28 days (time frame: 16-40 days), 84 days (70-98 days), 168 days (150-186 days) after SCI. This study focuses on the patient status at discharge. For the current study, patients with missing information on SCI characteristics (completeness, neurological level) were excluded (n = 9), as were persons who died during rehabilitation or shortly after discharge to a hospital (n = 12), as well as one person admitted for a second SCI. Ethical approvals were obtained from all responsible ethics committees (Ethics Committee Northwest and Central Switzerland (EKNZ) 100/13, Ethics Committee Lucerne (LU) 12090; Ethics Committee Zurich (KEK Zurich) 2013-0249; Ethics Committee Valais (CE Valais) 032/13).

Neuro-urological management

All participating rehabilitation centers adopt a patient-tailored bladder management approach that is based on the European Urology Association Guidelines on Neuro-Urology [7]. In brief, the therapeutic strategy aims to preserve and promote both upper and LUT function, and treatment decisions are based on urodynamic investigation. Indications for bladder storage medication include: presence of NDO, urinary incontinence episodes resulting from NDO, and low bladder capacity. Refractory bladder storage symptoms are treated with intradetrusor onabotulinumtoxinA injections as a second-line treatment. Intermittent self-catheterization is the preferred bladder emptying method for persons who are unable to achieve complete bladder emptying via spontaneous voiding. Suprapubic catheters are utilized when intermittent self-catheterization is not feasible —especially in persons with upper extremity impairments [7, 15, 17].

Study measures

Urological management. Urological management data was extracted from the clinical record for SDS participants within 40 days after SCI and at discharge from rehabilitation, based on the International Spinal Cord Society (ISCoS) LUT Function Basic Data Set [18]. This data set contains information on LUT surgeries, including the last performed dates for suprapubic catheter insertion and intradetrusor onabotulinumtoxinA injections, as well as information on bladder emptying method. Data on medication usage were extracted from the clinical record reflecting status during a 1-week period at each data collection time point. Based on expert input, use of bladder storage medication was defined as any of the following medications: the antimuscarinics oxybutynin, tolterodine, solifenacin, trospium chloride, darifenacin, fesoterodine, and the beta-3 agonist mirabegron.

Routine clinical data, neurological assessment and functional independence. Routine data extracted from the clinical record included: demographic information (sex, age), characteristics of the rehabilitation stay (rehabilitation center, dates of admission and discharge), and SCI history (etiology—TSCI or NTSCI, date of SCI diagnosis). Neurological condition was evaluated using the International Standards for Neurological Classification of Spinal

Cord Injury (ISNCSCI) assessment (neurological level, American Spinal Injury Association Impairment Scale (AIS) Grade) [19]. Functional independence was assessed using the Spinal Cord Independence Measure III [20], and was used here to provide contextual information regarding femalemale differences at baseline.

Modeling considerations

As this study was targeting population-level inference on the role of biological sex as an indicator of urological management, the models for both bladder storage medication and suprapubic catheter use included the potential predictors age, neurological level, AIS grade, SCI etiology, and rehabilitation center.

Statistical analyses

All continuous variables were tested for normality and found to have nonnormal distributions, so non-parametric tests (Kruskal-Wallis) were used in univariable baseline descriptions of the study population. Chi-squared tests were applied to categorical variables in the corresponding analyses. Binomial exact confidence intervals (CIs) are reported with proportions. Sampling bias was evaluated, and inverse probability weights (IPWs) were used to correct for differences in study participation identified between the SDS and the source population in all regression analyses (Supplement 1). Logistic regression analyses stratified on sex were used to generate weighted prevalence predictions for the use of bladder storage medication and suprapubic catheters at the time of discharge, as well as to identify the predictors of the respective outcomes. Models including both sexes were then run to confirm the findings of the stratified analyses. Age was divided into categories according to ISCoS [21] (16-30, 31-45, 46-60, 61-75, 76 or older). A combined variable for neurological level and AIS grade, "SCI severity" was employed: Cervical AIS A, B, C; Thoracic AIS A, B, C; Lumbar/Sacral AIS A, B, C, all AIS D/E as model testing indicated that it was the categorization that best accounted for interactions between AIS grade and neurological level, and additionally was in line with ISCoS reporting recommendations [21]. When age was included as a continuous variable, linearity was tested using multivariable fractional polynomial models, and a variable with a cubic transformation was employed in the final analysis.

Because SCI characteristics have been shown to stabilize during the course of the first year [22], for descriptive and logistic regression analyses, missing data from the baseline ISNCSCI assessment (n = 48, 6%) were addressed using a next observation carried backwards approach. Likewise, for cases missing ISNCSCI data at discharge (n = 52, 7%), a last observation carried forward approach was used. In variables with more than two categories, significance testing was first performed via global Wald tests, and in case there was a joint effect of all categories, post hoc Wald tests were performed to investigate the relationships between each set of categories. All p values based on post hoc testing presented here are Bonferroni-adjusted to account for multiple testing. Analyses were performed in Stata statistical software, version 16.1 for Windows (StataCorp LLC: College Station, TX, USA).

RESULTS

Out of the 748 participants admitted to rehabilitation for acute SCI from May 2013 to September 2021, 219 (29%) were female. Females were more likely to have an NTSCI, a shorter length of stay, as well as higher functional independence scores than men, 61% of females had an AIS D SCI as opposed to 53% of males. There were also differences in sex distributions between centers (Table 1). A relationship between age and sex was not identified when age was analyzed as a continuous variable. Sampling bias was identified with multivariable logistic regression analysis, the SDS population tended to have a younger age, lower proportion of females, and earlier admission to rehabilitation. Additionally, participation varied among rehabilitation centers (Supplement 1). The median (quartile 1 (Q1)–quartile 3 (Q3)) time to discharge from rehabilitation was 159 (93–224) days, or 5.3 (3.1–7.5) months after SCI.

Bladder storage medications were used by 28% (95% Cl: 25-31%) (n=204) of the population at discharge (2% missing data at discharge) (Table S2), 25% of whom (n=52) used mirabegron. In both sexes, the majority of the persons with a lumbar SCI that used a bladder storage medication had a

Table 1. Baseline characteristics of the study population.

Length of stay (days) [0] 139 (75-201) 124 (61-171) 153 (84-212) <0.001	Characteristic [% Missing]	Overall	Female	Male	
Age at SCI [0] 55 (40-67) 55 (41-68) 55 (39-66) 0.48 SCIM III score [9] 35 (21-62) 44 (26-69) 32 (16-57) <0.001	Study population	N = 748	N = 219	N = 529	
SCIM III score [9]	Continuous variables	Median (Q1–Q3)	Median (Q1–Q3)	Median (Q1–Q3)	р
Length of stay (days) [o] 139 (75-201) 124 (61-171) 153 (84-212) <0.001 Time to rehab admission (days) [o] 14 (9-24) 13 (8-22) 14 (9-25) 0.15 Categorical variables n (%) n (%) n (%) n (%) p Age at SCI [o] 85 (fb)	Age at SCI [0]	55 (40-67)	55 (41–68)	55 (39–66)	0.48
Time to rehab admission (days) [0] 14 (9-24) 13 (8-22) 14 (9-25) 0.15 Categorical variables n (%) n (%) n (%) p Age at SCI [0] 110 (15) 25 (11) 85 (16)	SCIM III score [9]	35 (21–62)	44 (26-69)	32 (18–57)	<0.001
Categorical variables n (%) n (%) n (%) p Age at SCI [0]	Length of stay (days) [0]	139 (75–201)	124 (61–171)	153 (84–212)	<0.001
Age at SCI [0] 110 (15) 25 (11) 85 (16) 31-45 132 (18) 50 (23) 82 (16) 46-60 231 (31) 58 (26) 173 (33) 61-75 217 (29) 63 (29) 154 (29) 76 or older 58 (7) 23 (11) 35 (6) Lesion etiology [0] TOTA TAMARIA SCI 306 (41) 113 (52) 193 (36) Neurological category [°] 441 (59) 105 (48) 336 (64) Traumatic SCI 441 (59) 105 (48) 35 (7) C1-C4 AlS A (n=17), 8 (n=8), C (n=19) 44 (6) 9 (4) 35 (7) C5-C8 AlS A (n=24), 8 (n=18), C (n=17) 59 (8) 14 (6) 45 (8) T1-T12 AlS A (n=103), 8 (n=35), C (n=36) 174 (23) 43 (20) 131 (25) T1-T2 AlS A (n=103), 8 (n=35), C (n=36) 174 (23) 43 (20) 131 (25) L1-S5 AlS AlS A (n=17), 8 (n=22), C (n=20) 60 (8) 20 (9) 40 (7) All AlS D 21 (32) 42 (22) 175 (36) SCIM Ill score [9] 44 (20) 52 (20) 15 (36)	Time to rehab admission (days) [0]	14 (9–24)	13 (8–22)	14 (9–25)	0.15
16-30 110 (15) 25 (11) 85 (16) 31-45 132 (18) 50 (23) 82 (16) 46-60 231 (31) 58 (26) 173 (33) 61-75 217 (29) 63 (29) 154 (29) 76 or older 58 (7) 23 (11) 35 (6) Lesion etiology [0] Townstraumatic SCI 306 (41) 113 (52) 193 (36) Non-traumatic SCI 441 (59) 105 (48) 336 (64) Neurological category [°] ************************************	Categorical variables	n (%)	n (%)	n (%)	р
31-45	Age at SCI [0]				0.018
46-60 231 (31) 58 (26) 173 (33) 61-75 217 (29) 63 (29) 154 (29) 76 or older 58 (7) 23 (11) 35 (6) Lesion ettology [0]	16–30	110 (15)	25 (11)	85 (16)	
61-75	31–45	132 (18)	50 (23)	82 (16)	
76 or older 58 (7) 23 (11) 35 (6) Lesion etiology [0] (0.001) (0.0	46–60	231 (31)	58 (26)	173 (33)	
Lesion etiology [0]	61–75	217 (29)	63 (29)	154 (29)	
Non-traumatic SCI 306 (41) 113 (52) 193 (36) Traumatic SCI 441 (59) 105 (48) 336 (64) Neurological category [*]	76 or older	58 (7)	23 (11)	35 (6)	
Traumatic SCI 441 (59) 105 (48) 336 (64) Neurological category [³]	Lesion etiology [0]				<0.001
Neurological category [*] 44 (6) 9 (4) 35 (7) C5-C8 AIS A (n = 17), B (n = 8), C (n = 19) 44 (6) 9 (4) 35 (7) C5-C8 AIS A (n = 24), B (n = 18), C (n = 17) 59 (8) 14 (6) 45 (8) T1-T12 AIS A (n = 103), B (n = 35), C (n = 36) 174 (23) 43 (20) 131 (25) L1-55 AIS AIS A (n = 17), B (n = 23), C (n = 20) 60 (8) 20 (9) 40 (7) AII AIS D 41 (18) D 278 (53) SCIM III score [9] (26 (33) 67 (34) 159 (33) 50-Z4 217 (32) 42 (22) 175 (36) 25-49 226 (33) 67 (34) 159 (33) 50-74 134 (20) 52 (27) 82 (17) 75-100 104 (15) 34 (17) 70 (14) Admission >40 days after SCI ^b [0] 75-100 666 (89) 197 (90) 669 (89) Yes 82 (11) 22 (10) 60 (11) Length of stay (days) [0] 53 (24) 86 (17) 61-120 175 (23) 53 (24) 86 (17) 61-120 175 (23) 53 (24) 86 (17) 61-120 175 (23) 53 (24) 122 (23) 121-180 201 (27) 63 (29) 138 (26) Eenter [0] 661 (30) 121 (23) Center [1] 661 181 (25) 66 (30) 121 (23) Center [2] 661 (3) 16 (5) 48 (22) 68 (13) Center [2] 661 (3) 16 (5) 48 (22) 68 (13)	Non-traumatic SCI	306 (41)	113 (52)	193 (36)	
C1-C4 AIS A (n = 17), B (n = 8), C (n = 19) C5-C8 AIS A (n = 24), B (n = 18), C (n = 17) C5-C8 AIS A (n = 24), B (n = 18), C (n = 36) T1-T12 AIS A (n = 103), B (n = 35), C (n = 36) L1-S5 AIS AIS A (n = 17), B (n = 23), C (n = 20) AII AIS D AII AIS D C17 (32) C27 (33) C27 (34) C28 (33) C27 (34) C28 (37) C30 (34) C4 (34) C4 (34) C4 (22) C4 (22) C4 (22) C4 (Traumatic SCI	441 (59)	105 (48)	336 (64)	
C5-C8 AIS A (n = 24), B (n = 18), C (n = 17) 59 (8) 14 (6) 45 (8) T1-T12 AIS A (n = 103), B (n = 35), C (n = 36) 174 (23) 43 (20) 131 (25) L1-S5 AIS AIS A (n = 17), B (n = 23), C (n = 20) 60 (8) 20 (9) 40 (7) All AIS D 411 (55) 133 (61) 278 (53) SCIM III score [9]	Neurological category [a]				0.16
T1-T12 AIS A (n = 103), B (n = 35), C (n = 36) L1-S5 AIS AIS A (n = 17), B (n = 23), C (n = 20) 60 (8) 20 (9) 40 (7) All AIS D 411 (55) 133 (61) 278 (53) SCIM III score [9]	C1–C4 AIS A ($n = 17$), B ($n = 8$), C ($n = 19$)	44 (6)	9 (4)	35 (7)	
L1-S5 AIS AIS A (n = 17), B (n = 23), C (n = 20) 60 (8) 20 (9) 40 (7) All AIS D 411 (55) 133 (61) 278 (53) SCIM III score [9] <0.001	C5-C8 AIS A (n = 24), B (n = 18), C (n = 17)	59 (8)	14 (6)	45 (8)	
All AIS D 411 (55) 133 (61) 278 (53) SCIM III score [9] <	T1–T12 AIS A ($n = 103$), B ($n = 35$), C ($n = 36$)	174 (23)	43 (20)	131 (25)	
SCIM III score [9] <0.001 0-24 217 (32) 42 (22) 175 (36) 25-49 226 (33) 67 (34) 159 (33) 50-74 134 (20) 52 (27) 82 (17) 75-100 104 (15) 34 (17) 70 (14) Admission >40 days after SCI ^b [0]	L1-S5 AIS AIS A $(n = 17)$, B $(n = 23)$, C $(n = 20)$	60 (8)	20 (9)	40 (7)	
0-24 217 (32) 42 (22) 175 (36) 25-49 226 (33) 67 (34) 159 (33) 50-74 134 (20) 52 (27) 82 (17) 75-100 104 (15) 34 (17) 70 (14) Admission >40 days after SCI ^b [0] TO (14) 50.56 No 666 (89) 197 (90) 469 (89) Yes 82 (11) 22 (10) 60 (11) Length of stay (days) [0] 53 (24) 86 (17) 1-60 139 (19) 53 (24) 86 (17) 61-120 175 (23) 53 (24) 122 (23) 121-180 201 (27) 63 (29) 138 (26) 181 or more 231 (31) 50 (23) 181 (34) Center [0] To Center [0] \$0.001 Center 2 116 (15) 48 (22) 68 (13) Center 3 126 (17) 35 (16) 91 (17)	All AIS D	411 (55)	133 (61)	278 (53)	
25-49 226 (33) 67 (34) 159 (33) 50-74 134 (20) 52 (27) 82 (17) 75-100 104 (15) 34 (17) 70 (14) Admission >40 days after SCI ^b [0]	SCIM III score [9]				<0.001
50-74 134 (20) 52 (27) 82 (17) 75-100 104 (15) 34 (17) 70 (14) Admission >40 days after SCI ^b [0]	0–24	217 (32)	42 (22)	175 (36)	
75–100 104 (15) 34 (17) 70 (14) Admission >40 days after SCI ^b [0]	25–49	226 (33)	67 (34)	159 (33)	
Admission >40 days after SCI ^b [0] No 666 (89) 197 (90) 469 (89) Yes 82 (11) 22 (10) 60 (11) Length of stay (days) [0] 1-60 139 (19) 53 (24) 86 (17) 61-120 175 (23) 53 (24) 122 (23) 121-180 201 (27) 63 (29) 138 (26) 181 or more Center [0] Center [0] Center 1 187 (25) 66 (30) 121 (23) Center 2 116 (15) 48 (22) 68 (13) Center 3	50–74	134 (20)	52 (27)	82 (17)	
No 666 (89) 197 (90) 469 (89) Yes 82 (11) 22 (10) 60 (11) Length of stay (days) [0] 53 (24) 86 (17) 1-60 139 (19) 53 (24) 86 (17) 61-120 175 (23) 53 (24) 122 (23) 121-180 201 (27) 63 (29) 138 (26) 181 or more 231 (31) 50 (23) 181 (34) Center [0]	75–100	104 (15)	34 (17)	70 (14)	
Yes 82 (11) 22 (10) 60 (11) Length of stay (days) [0] - <	Admission >40 days after SCI ^b [0]				0.56
Length of stay (days) [0] <	No	666 (89)	197 (90)	469 (89)	
1-60 139 (19) 53 (24) 86 (17) 61-120 175 (23) 53 (24) 122 (23) 121-180 201 (27) 63 (29) 138 (26) 181 or more 231 (31) 50 (23) 181 (34) Center [0] <0.001	Yes	82 (11)	22 (10)	60 (11)	
61–120 175 (23) 53 (24) 122 (23) 121–180 201 (27) 63 (29) 138 (26) 181 or more 231 (31) 50 (23) 181 (34) Center [0] <	Length of stay (days) [0]				<0.01
121–180 201 (27) 63 (29) 138 (26) 181 or more 231 (31) 50 (23) 181 (34) Center [0] <0.001	1–60	139 (19)	53 (24)	86 (17)	
181 or more 231 (31) 50 (23) 181 (34) Center [0] <0.001	61–120	175 (23)	53 (24)	122 (23)	
Center [0]	121–180	201 (27)	63 (29)	138 (26)	
Center 1 187 (25) 66 (30) 121 (23) Center 2 116 (15) 48 (22) 68 (13) Center 3 126 (17) 35 (16) 91 (17)	181 or more	231 (31)	50 (23)	181 (34)	
Center 2 116 (15) 48 (22) 68 (13) Center 3 126 (17) 35 (16) 91 (17)	Center [0]				<0.001
Center 3 126 (17) 35 (16) 91 (17)	Center 1	187 (25)	66 (30)	121 (23)	
Center 3 126 (17) 35 (16) 91 (17)	Center 2	116 (15)	48 (22)	68 (13)	
Center 4 319 (43) 70 (32) 249 (47)	Center 3	126 (17)	35 (16)		
	Center 4	319 (43)	70 (32)	249 (47)	

Percentages are calculated for cases not missing the respective variable.

AIS American Spinal Injury Association (ASIA) Impairment Scale, C cervical, L lumbar, S sacral, SCI spinal cord injury, SCIM Spinal Cord Independence Measure, T thoracic.

neurological level of L1 or L2, and bladder storage medication was not used at all in persons with sacral SCI. Further information on bladder storage medication use during rehabilitation is provided in the Supplementary Material (Supplement 2, Table S2). A total of 21 patients (3% of the population), had intradetrusor onabotulinumtoxinA injections before being discharged from rehabilitation, and 13 of these patients were using bladder storage medications at the time of discharge.

At discharge, females (23%, 95% CI: 17–29%) tended to use bladder storage medication less frequently than males (30%, 95% CI: 26–34%) in sex-stratified univariable analysis (Table S2). See Fig. 1 for the distribution of bladder storage medication use stratified according to sex and SCI characteristics. The adjusted weighted prevalence of bladder storage medication use in females was 24% (95% CI: 18–29%) and in males it was 30% (95% CI: 26–34%). SCI severity was a predictor of bladder storage

^aObservations missing neurological data at baseline (6%) are categorized using the next observation carried backwards approach.

^bDay 40 after SCI reflects the end of the baseline time point of the cohort study.

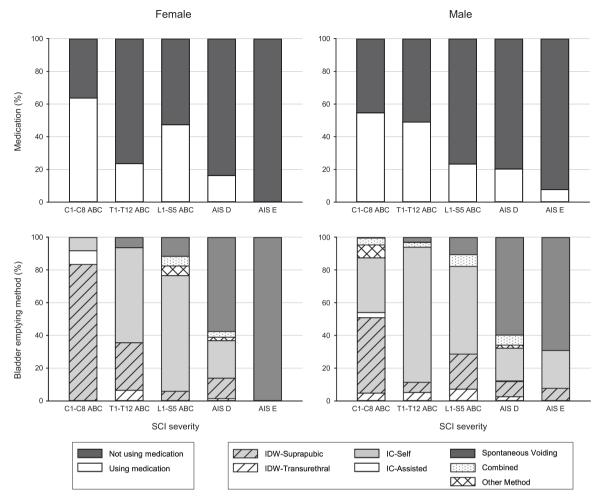


Fig. 1 Bladder storage medication use and bladder emptying method at discharge stratified according to sex and SCI characteristics. When SCI characteristics were not available, they were taken from the closest available time point after the very acute period. Other bladder emptying method refers to reflex triggering, bladder expression, and urinary diversion. AIS American Spinal Injury Association (ASIA) Impairment Scale, C cervical, IC intermittent catheter, IDW indwelling catheter L lumbar, S sacral, T thoracic.

medication use in both females and males (global p < 0.01, both groups) in stratified regression analyses. Additionally, for both groups SCI etiology was a potential predictor of bladder storage medication usage at discharge, the adjusted odds ratio (aOR) for NTSCI vs. TSCI for females: 0.50 (95% CI: 0.22-1.12); for males: aOR NTSCI 0.40 (95% CI: 0.24-0.66). In both sexes, cervical AIS grade A, B, C SCI was a potential predictor of bladder storage medication use, aOR vs. AIS D/E grades for females: aOR 6.91 (95% CI: 1.40-34.01, post hoc p = 0.14); for males: aOR 4.59 (95% CI: 2.51–8.40, post hoc p < 0.0001) (Table 2). However, in females, odds of bladder storage medication use at discharge were also higher in the lumbar/sacral A, B, C group (aOR 4.82 (95% CI: 1.69–13.77, post hoc p = 0.018), but not in the thoracic group. A post hoc test comparing cervical and lumbar/sacral AIS A, B, C SCI with thoracic AIS A, B, C and all AIS D indicated that these two groupings differed from each other p < 0.0001. In males, thoracic AIS A, B, C SCI aOR: 3.75 (95% CI: 2.26–6.22, post hoc p < 0.0001) was also a predictor of bladder storage medication use, with a post hoc test comparing cervical and thoracic AIS A, B, C SCI to the lumbar/sacral and all D groups indicating that the two categories differed from each other, p < 0.0001. In an analysis of bladder storage medication use combining both females and males the interaction between sex and SCI severity was statistically significant (p < 0.01), further supporting the findings from the stratified analyses (Fig. 2).

The most common bladder emptying method at discharge was spontaneous voiding (42%, 95% Cl: 39–46%), followed by

intermittent catheterization (37%, 95% CI: 34-41%) (4% missing bladder emptying data at discharge). Prevalence of suprapubic catheter use at discharge was 16% (95% CI: 13–19%) (n = 115) (Table S3). The overall distribution of bladder emptying method at discharge stratified according to sex and SCI characteristics is visualized in Fig. 1. Further information on suprapubic catheter use during rehabilitation is available in the Supplementary Material (Supplement 2, Table S3). In sex-stratified univariable analysis, 19% (95% CI: 14-25%) of females, and 15% (95% CI: 12–18%) of males used suprapubic catheters. Females with cervical (83%, 95% CI: 52-98) and thoracic (29%, 95% CI: 14-48) AIS grade A. B. C SCI, tended to use suprapubic catheters more frequently at discharge than males (cervical 48%, 95% CI: 35-61; thoracic 7%, 95% CI: 3-14) (Table S3). In adjusted analyses stratified on sex, females had a weighted prevalence of suprapubic catheter use of 22% (95% CI: 17–28%), while in males the weighted prevalence was 17% (95% CI: 14-20%). Age >60 (post hoc p < 0.001, both sexes), and cervical AIS A, B, C SCI (post hoc p < 0.001, both sexes) were predictors of suprapubic catheter use in both females and males (Table 3). Females with a thoracic AIS grade A, B, C SCI also had higher odds of suprapubic catheter use compared to persons with AIS D SCI, aOR 5.11 (95% CI: 1.27–20.62, post hoc p = 0.12). In agreement with the findings of the sex-stratified analyses, there was an interaction between sex and SCI severity in combined analysis, p = 0.013. Predicted probabilities of suprapubic catheter use according to sex, age,

Predictor	Female univariable odds <i>p</i> ratio (OR)	Female adjusted odds ratio (aOR)	Ф	Male univariable odds ratio (OR)	d	Male adjusted odds ratio (aOR)	d
Age at SCI		0.46	0.34		0.79		0.71
16–30	REF	REF		REF		REF	
31–45	0.55 (0.18–1.66)	0.67 (0.20–2.25)		0.93 (0.48–1.80)		1.46 (0.73–2.94)	
46-60	0.39 (0.13–1.19)	0.43 (0.12–1.52)		0.87 (0.49–1.53)		1.52 (0.82–2.82)	
61–75	0.78 (0.28–2.23)	1.30 (0.38–4.36)		0.70 (0.39–1.26)		1.27 (0.66–2.45)	
76+	0.53 (0.14–2.01)	1.06 (0.25–4.46)		0.84 (0.34–2.03)		1.52 (0.65–3.54)	
SCI etiology		0.042	0.09		<0.0001		<0.001
Non-traumatic SCI	0.49 (0.25–0.97)	0.50 (0.22–1.12)		0.33 (0.21–0.52)		0.40 (0.24–0.66)	
Traumatic SCI	REF	REF		REF		REF	
SCI severity	V	<0.01	<0.01		<0.0001		<0.0001
Cervical AIS A, B, C	8.80 (2.21–34.98)	6.91 (1.40–34.01)		5.22 (2.92–9.30)		4.59 (2.51–8.40)	
Thoracic AIS A, B, C	1.29 (0.51–3.27)	0.90 (0.32–2.50)		3.78 (2.31–6.18)		3.75 (2.26–6.22)	
Lumbar/Sacral AIS A, B, C	4.18 (1.51–11.58)	4.82 (1.69–13.77)		1.07 (0.43–2.65)		1.02 (0.40–2.58)	
AIS D/E	REF	REF		REF		REF	
			-				

Results from logistic regression analyses stratified on sex, with inverse probability weighting to account for sampling bias. Use of antimuscarinics or beta-3 agonists at discharge is coded as "1". Adjusted regression also included rehabilitation center as a covariate (results not shown). AIS American Spinal Injury Association (ASIA) Impairment Scale, SCI spinal cord American Spinal Injury Association

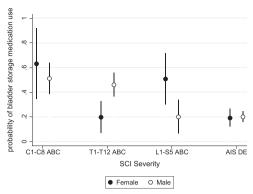


Fig. 2 Predicted probability of using bladder storage medication according to SCI characteristics and sex. Predictions are from a logistic regression analysis with use of bladder storage medication at discharge coded as "1". This model included females and males together with an interaction between sex and SCI severity (p < 0.01), and was also was adjusted for age, SCI etiology and rehabilitation center.

and SCI severity are shown in Fig. 3. At discharge, 44 persons (38%) who used a suprapubic catheter also used bladder storage medication, 30 of whom (68%) had a cervical SCI. Sixteen of the dual bladder storage medication and suprapubic catheter users were female, of whom 9 (56%) had a cervical SCI.

DISCUSSION

In this study we examined the sex-specific prevalence and indicators of bladder storage medication and suprapubic catheters use during SCI rehabilitation. Cervical AIS grade A, B, C SCI and TSCI were predictors of bladder storage medication use in both females and males, however thoracic AIS grade A, B, C SCI was only a predictor for males, and lumbar AIS grade A, B, C SCI was only a predictor for females. Age >60 and cervical AIS grade A, B, C SCI were predictors of suprapubic catheter use in both sexes, while thoracic AIS grade A, B, C SCI was tentatively an additional predictor of suprapubic catheter use in females.

The current results indicate that female-male differences in the use of bladder storage medication during SCI rehabilitation mainly occur in relation to SCI characteristics despite substantial sex differences in the anatomy and physiology of the LUT, such as shorter urethral length in females, presence of the prostate in males, as well as differing pelvic floor physiology and distribution of muscarinic receptor subtypes [13]. The tendency toward females using less bladder storage medication in unadjusted analyses might be at least partially attributable to the fact that the female population also had a higher prevalence of NTSCI. To the best of our knowledge, there are no existing studies investigating the relationship between sex and the usage of bladder storage medication during the rehabilitation period to serve as a basis for comparison. The evidence regarding differences in the prevalence of bladder storage medication use in females and males in the community setting is also scarce, although there was one study that did not find female-male differences in a population where 63% of the participants used antimuscarinics [23]. Based on the proposed mechanism for NDO, we had expected that the prevalence of bladder storage medication use might be lower in the group with lumbar SCI compared to groups with higher neurological levels, as in the lumbar groups the sympathetic innervation that relaxes the bladder could be at least partially spared [24, 25]. While this pattern was evident in the male population at the time of discharge, it was not observed in females. One possible explanation is that suprapubic catheter use could be reducing some of the need for bladder storage medication in females with thoracic AIS grade A, B, C SCI [14],

rable 2. Predictors of using bladder storage medication at the time of discharge from rehabilitation

<0.0001 <0.0001 0.56 ۵ Male adjusted odds ratio (aOR) 14.76 (3.95–55.08) 14.18 (5.85–34.35) 4.49 (1.81-11.14) 1.32 (0.50-3.51) 2.60 (0.68-9.87) 0.67 (0.21-2.14) 1.23 (0.61-2.46) 0.68 (0.25-1.82) RFF 땲 <0.0001 <0.0001 0.75 ۵ Male univariable odds ratio (OR) 5.88 (2.25-15.36) 6.06 (3.19–11.51) 0.59 (0.25-1.39) 0.48 (0.16-1.48) 2.08 (0.98-4.41) 0.51 (0.21-1.21) 1.87 (0.67-5.22) 1.09 (0.64-1.87) 땲 땲 <0.0001 <0.01 0.39 ۵ Female adjusted odds ratio (aOR) Table 3. Predictors of suprapubic catheter use at the time of discharge from rehabilitation. 22.65 (2.30-223.30) 13.57 (1.28-143.96) 49.66 (8.88–277.71) 2.04 (0.21-20.21) 4.35 (0.45-42.53) 4.19 (1.26-14.00) 0.63 (0.22-1.81) 0.93 (0.16-5.52) REF RF <0.001 <0.01 0.34 ۵ Female univariable odds ratio (OR) 33.40 (6.46-172.73) 4.15 (0.74-23.35) 4.97 (1.03-23.94) 1.86 (0.36-9.51) 0.62 (0.09-4.06) 0.70 (0.33-1.47) 2.47 (0.94-6.48) 0.33 (0.04-2.69) RFF RFF Lumbar/Sacral AIS A, B, C Thoracic AIS A, B, C Cervical AIS A, B, C SCI etiology SCI severity Age at SCI AIS D/E Predictor 31-45 16-30 46-60 61-75 NTSCI TSCI

Results from logistic regression analyses stratified on sex, with inverse probability weighting to account for sampling bias. Use of a suprapubic catheter at discharge is coded as "1". Adjusted regression models also included rehabilitation center as a covariate (results not shown). AIS American Spinal Injury Association (ASIA) Impairment Scale, C cervical, L lumbar, S sacral, T thoracic. but this hypothesis could not be tested with the available information in this data set. In order to understand the factors underlying the current results, further research which utilizes information from urodynamics investigation and also includes a large female population is necessary.

Reports from the literature have indicated that females are expected to have a higher prevalence of suprapubic catheter use than males [14, 15, 17], and this trend could also be observed in the present population, especially in the younger age groups. Previously proposed explanations for the higher rates of suprapubic catheter insertion in women include less straightforward access to the urethra, transferring difficulties [14, 15], which along with other factors, could lead to a suprapubic catheter allowing women to have more independence [8]. In a community setting, the time required for catheterization through the urethra tended to be substantially longer for a small sample of women who were overweight or who required caregiver support [26], indicating that the suprapubic catheter might be the more convenient option for some [8]. A final factor identified in the community setting, "lack of sitting balance" was more commonly cited by females than males as an explanation of inability to perform intermittent catheterization independently [27], and this might also provide a suggestion as to why thoracic AIS grade A,B,C SCI is tentatively a female-specific predictor of suprapubic catheter use in the present study. As sitting balance represents a potentially modifiable factor, this would also represent a route for further intervention if this relationship can be definitively established. The other risk factors identified in both sexes, in particular older age [3] and cervical SCI also are in agreement with the existing body of evidence [14, 15].

Secondary findings of this study include additional factors associated with bladder storage medication and suprapubic catheter use in both sexes. The relationship between SCI etiology and antimuscarinic use has not been directly addressed before in the literature. Our previous findings from this cohort have shown that there is a higher comorbidity load in the NTSCI population [10], so concerns about interactions and side effects such as constipation and potential cognitive impact, might explain some of the hesitancy to prescribe bladder storage medication to persons with NTSCI [12, 28]. To fully investigate this hypothesis, as for other domains in the SCI field [9], further investigation is needed, in the form of well-designed population-based cohort studies capturing the full spectrum of comorbidities before SCI as well as secondary health conditions in this population.

A strength of this descriptive study is its representativeness, as it utilizes data from a population-based cohort that covers all of the specialized post-acute SCI rehabilitation centers in Switzerland. Furthermore, the use of inverse probability weighting minimized the potential for sampling bias. The present epidemiological inference may well apply to other high-income settings, although it remains to be seen whether local policy differences regarding length of rehabilitation stay and thereby the time to discharge affect the transferability of these study findings. Differences in referral patterns between countries and their respective healthcare systems might also affect the applicability of results to other settings. In the context of TSCI in Switzerland, it has previously been shown that women, the elderly and persons with lumbar and sacral lesions are less likely to be enrolled by the SwiSCI cohort [29]. This study is also performed in a population with a comparatively large number of female participants, making it well-powered for the SCI context, nevertheless, the CIs in adjusted analyses in the oldest age groups, females with cervical AIS grade A, B, C SCI, and both sexes with lumbar and sacral A, B, C SCI are still quite wide, indicating that there is still a relatively high degree of uncertainty in these groups. Further, although missing data in the predictor variables (SCI characteristics) was addressed by utilizing information from other time points, the relationships identified here

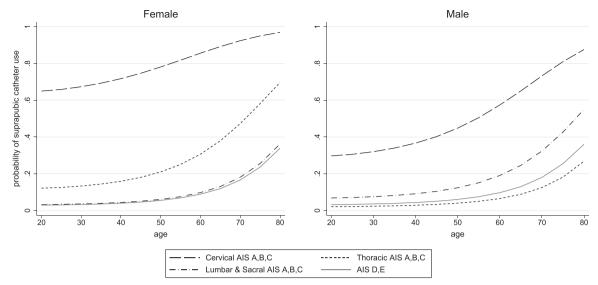


Fig. 3 Predicted probability of suprapubic catheter use according to SCI characteristics and sex. Predictions are from a logistic regression analysis with use of a suprapubic catheter at discharge coded as "1". This model included females and males together with age as a continuous variable that was transformed to account for non-linearity, and was also was adjusted for rehabilitation center and SCI etiology. For readability, female and male predictions were graphed separately. The interaction between sex, SCI severity and transformed age is statistically significant (p < 0.0001). The color version of this figure (available online) also contains 95% confidence intervals.

could be subject to bias if there is a relationship between the predictor variables and missingness of data in the outcome variables. Additional limitations to the potential of this data set to support analyses targeted at causal inference or evaluation of treatment effectiveness included lack of parameters regarding cognitive function, patient motivation, diagnostic examinations (i.e., urodynamics investigation), and pre-existing urological conditions such as pelvic floor dysfunction or prostatic outlet obstruction.

CONCLUSIONS

Our findings indicate a scope for female-specific research, in particular to understand potential mechanisms underlying the management differences between sexes in persons with AIS grade C or higher sub-cervical SCI. Although there may be considerable clinical expertise in how to manage NLUTD in women with SCI, this information needs to be systematically documented. A well-powered female-specific study, probably requiring an international effort, could help to identify potential targets of intervention and also to support patient-tailored management and female-specific guideline recommendations.

DATA AVAILABILITY

Owing to our commitment to SwiSCI study participants and their privacy, data sets generated during the current study are not made publicly available. The SwiSCI study center requires, on behalf of the SwiSCI Study Group, contact prior to any planned data usage (contact@swisci.ch).

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AUTHOR CONTRIBUTIONS

CEA, VB, TMK, and MWGB were responsible for the design and conceptualization of the study. Statistical analysis was performed by CEA and MWGB. CEA, VB, MDL, XJ, EL,

SM, JP, TMK, and MWGB analyzed and interpreted the data. The manuscript was drafted by CEA, with the support of VB, TMK, and MWGB. All authors provided critical feedback on the manuscript regarding important intellectual content, and provided their approval on the final version.

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COMPETING INTERESTS

The authors declare no competing interests.

ETHICAL APPROVAL

Ethical approval was granted by all responsible ethics committees: Ethics Committee Northwest and Central Switzerland (EKNZ) 100/13, Ethics Committee Lucerne (LU) 12090; Ethics Committee Zurich (KEK Zurich) 2013-0249; Ethics Committee Valais (CE Valais) 032/13). We certify that all applicable institutional and governmental regulations concerning the ethical use of human volunteers were followed during the course of this research.

ADDITIONAL INFORMATION

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