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Societal costs of older adults with low back pain seeking chiropractic care: findings from the BACE-C cohort study

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Abstract

Background To describe the societal costs during one year of follow-up among older adults seeking chiropractic care due to a new episode of low back pain (LBP), and to determine what factors predict high societal costs in this population.

Methods Prospective cohort study, within chiropractic private practices (n = 38) in the Netherlands. 223 people \geq 55 years of age with a new episode of LBP seeking chiropractic care participated. The primary outcome was total societal costs. High societal costs were defined as patients with costs in the top 20th percentile. The final prediction models were obtained using forward selection. Results were presented for the total population and stratified for retirement status. The model's prognostic accuracy (Hosmer–Lemeshow X², Nagelkerke's R²) and discriminative ability [area under the receiver operating curve (AUC)] were assessed, and the models were internally validated using bootstrapping.

Results The mean total annual societal cost per patient was €5297 [95% confidence interval (CI): 4191–6403]. The biggest cost driver was presenteeism (65% of total costs), and costs were higher among non-retired participants (€7759; 95% CI 6047–9470) than retired participants (€1892; 95% CI 1088–2695). In the total population, younger age [odds ratio (OR): 0.87 for each additional year; 95% CI 0.80–0.95], being male instead of female (OR 2.96; 95% CI 1.19–7.44), less alcohol intake (OR 0.49; 95% CI 0.20–1.19), working instead of retirement (OR 9.37; 95% CI 1.83–48.04), and more disability at baseline (OR 1.08; 95% CI 1.00–1.16) were found to be predictive of high societal costs. Working was found to be the strongest predictor for high societal costs. After internal validation, the model's fit was good, it's explained variance was moderate (28%) and their AUCs could be interpreted as moderate (0.85). For non-pensioners, the same predictive factors were identified as for the entire population. The costs for the retired participants showed too little variation to be able to predict high costs.

Conclusions This study estimated the mean total annual societal cost of older adults seeking chiropractic care due to a new episode of LBP at €5297 (95% CI 4191–6403). These costs were mainly due to high levels of presenteeism, and extensively differed based upon work status.

Keywords Low back pain, Older adults, Societal costs, Prediction

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Introduction

Low back pain (LBP) is a major cause of sickness absence, work disability, reduced productivity, and early retirement [1, 2]. LBP and its related sickness absence are associated with significant costs for individuals and society, which are expected to increase during the upcoming decades due to the aging population [3]. Despite this, there is limited information about the clinical trajectory and societal ramifications of LBP in older adults compared to their younger counterparts.

LBP ranks among the most prevalent complaints encountered in primary care. For primary care providers (e.g. physiotherapists, chiropractors) it is important to identify risk factors that are associated with higher costs in older adults with LBP. If such factors are identified and known, targeted interventions can be offered before incurring substantial avoidable costs and a decline in health status. The Commonwealth Fund (2012) underlines the importance of addressing high-cost users with chronic conditions [4]. A recent study in the Netherlands identified factors associated with high societal costs among people with chronic LBP, including poor physical health, high functional disability, low health-related quality of life, high impact of pain experience, and non-Dutch nationality [5]. However, older people with LBP might have different cost-patterns in comparison to younger people with LBP (e.g. due to their retirement and/or comorbidities). Therefore, it is important to identify the possible risk factors for high costs in older adults with LBP as well.

To improve use of scarce resources and thus to reduce the burden on our healthcare systems, research has highlighted the importance of monitoring and understanding healthcare utilisation and costs related to LBP for older adults [6]. Improving our understanding of this population and the course of their LBP and costs related to their LBP may provide valuable input for studies regarding the effectiveness and cost-effectiveness of chiropractic care.

This study investigates factors associated with high costs of LBP in older adults using the BAck Complaints in the Elders-Chiropractic (BACE-C) study, an international cohort study dedicated to examining back complaints in older patients in primary care [4]. The BACE-C study is uniquely positioned in the chiropractic care setting due to limited information about the clinical course of LBP in older adults, especially those seeking chiropractic care. The primary objectives of the BACE-C study were to examine the one-year clinical course of pain intensity and improvement rates of LBP in individuals aged 55 years and older who visit a chiropractor for a new episode of LBP. Cost data were also collected within the same population, offering an opportunity to study the costs related to LBP in this demographic—an essential

step considering the historical underrepresentation of older people in back pain research [4].

The primary objective of this study is to study societal costs over one year incurred by older adults in the Netherlands who consult a chiropractor for a new episode of LBP. The second objective is to identify predictive factors associated with high societal costs in older adults with LBP.

Methods

This study is reported according to the consensus-based checklist for the critical appraisal of cost-of-illness studies [7] (Appendix 1). A study protocol of the BACE-C has been published [8]. Ethics approval has been obtained by the Medical Ethics Committee of the Vrije University Medical Center, the Netherlands ethics number 2017–618.

Study design and setting

The Back Complaints in Elderly-Chiropractic (BACE-C) study was designed as an international, multi-centred prospective cohort study. The BACE-C is part of the international BACE consortium [9]. For this study, only Dutch participants were included, and recruited from 38 private practices of chiropractors in the Netherlands. All questionnaires were completed electronically. Follow-up measurements were collected at 2 and 6 weeks, 3, 6 and 9 months, and one year after the first treatment. The data collected at 2 and 6 weeks were not used in this study as data on costs were not included at those follow-up moments.

Participants

Inclusion criteria: Adults aged 55 and older who consulted a chiropractor for a new episode of LBP, meaning LBP for the first time, or those adults who have not been to a chiropractor in the previous six months were eligible for inclusion. This is independent of whether they have seen another type of healthcare provider for the current episode. All low back complaints, with pain in the region from the thoracolumbar 12th rib junction to the first sacral vertebrae, including pelvic pain and pain referral to the leg(s) were eligible. Chiropractors who are licensed and currently work in clinical practice were asked to participate.

Exclusion criteria: Patients with cognitive disorders, a suspected tumour, fracture, infection or any other potential red flag or condition considered to be a contraindication for chiropractic care were excluded.

Outcome measures

The primary outcome for the first objective was total annual societal costs, and total societal costs separated by cost category and by three-month time frames. Societal costs were measured using 3-monthly retrospective cost questionnaires throughout the 1-year study period (i.e. administered at 3-, 6-, 9- and 12-month follow-up), which is included in Appendix 2. The self-administered cost questionnaires included measures of health care utilisation, informal care, unpaid productivity, presenteeism and absenteeism. Health care utilisation included primary care (e.g. general practitioner care, manual therapy, physical therapy, exercise therapy) and secondary care (e.g. diagnostic and therapeutic interventions, hospitalisation) [10]. Data from the updated Dutch Manual of Costing were used to value costs of common health care services [11]. For less common healthcare services, hospital accounting records and/or prices of professional organisations were used. Informal care and unpaid productivity were valued using the recommended Dutch shadow price of €15.29 per hour [12]. Absenteeism and presenteeism from paid employment was measured using the Productivity and Disease Questionnaire [13], and was valued in accordance with the friction cost approach using hourly productivity costs of males and females [14]. The friction cost approach assumes that production losses are confined to the period needed to replace a sick worker (i.e. friction period), which is currently assumed to be 12 weeks in the Netherlands [14]. All costs were expressed in Euros 2021.

The primary outcome for objective 2 was having high societal costs (yes/no). Having high societal costs was defined as patients with costs in the top 20th percentile, which is consistent with previous studies [15–17]. For this study, the 20th percentile for societal costs was, therefore, assumed to be appropriate and feasible due to the relatively small sample size.

Potential predictive factors

Potential predictive factors for high societal costs were based on previous literature [15, 18], and were measured at baseline:

- LBP intensity, measured on an 11-point numeric rating scale (NRS) [19], ranging from 0 'no pain 'to 10 'the worst pain ever'.
- Back-specific functional status: Roland Morris Disability Questionnaire (RMDQ) [20].
- Global perceived effect (GPE), measured on a 7-point scale, ranging from 'completely recovered' to 'worse than ever' [21].
- Sociodemographic characteristics (i.e. age, gender, marital status, education level, height and weight (for BMI), ethnicity including parental ethnicity).
- Physical activity, measured with the International Physical Activity questionnaire.

- Other lifestyle variables: smoking measured by pack/ years, alcohol use measured by the short version of the AUDIT [22], and sleeping habits measured by the short version of the Pittsburgh Sleep Quality Index) [23].
- Comorbidities, measured with the Self-administered Comorbidity Questionnaire [24].
- Indicator screening tool (STarT Back) for poor outcome [25].
- Health-Related Quality-of-life, measured with the EQ-5D-5L [26].

Missing data

Missing data were visually explored, and missingness at random was assumed. Missing data were handled using multivariate imputation by chained equations to avoid possible bias due to selective drop-out of participants, which might influence the results when conducting a complete-case analysis [27]. The imputation model included sex, smoking, marital status, age, BMI, back pain complaint history, education, treatment expectations, and relevant baseline effect measure values. For each measurement moment, each cost category was imputed (primary care costs, secondary care costs, unpaid productivity, informal care, absenteeism, and presenteeism). Ten complete data sets were created so that the loss of efficiency would be smaller than 5%. Complete datasets were analysed as outlined below, after which pooled estimates were calculated using Rubin's rules [27].

Statistical analyses

Descriptive statistics (frequency counts and proportions) were used to describe the study cohort, and their related costs for the full year. Costs were described in euros with means (95% confidence intervals (CI)). Similarly, the total societal costs were presented separately for 3-month time frames.

The prediction model was constructed using multivariable logistic regression analysis. Univariate logistic regression was performed to pre-select variables based on statistical significance (p < 0.20). This was done because manual forward selection was used to obtain the final predictive factors with a p < 0.10. Variables with the lowest p-value were included in the model one by one and the analyses were re-run until only variables with a p < 0.10 constituted the model. A p < 0.10 was used to ensure that predictions are accurate, whilst preventing type-1 errors caused by overfitting [28]. We opted for manual forward selection because of the small sample size.

The overall performance and predictive ability of the model were tested using Nagelkerke R^2 [28, 29]. The

other performance measures included the area under the receiver operating characteristics curve (AUC) to measure the final model's discriminative value [28, 29].

To adjust for the fact that the model was developed and tested in the same population, which typically causes regression coefficients and performance measures to be overestimated (i.e. overfitting), bootstrapping was used to internally validate the model [29].

Descriptive statistics and prediction models were performed in Stata 17 (Stata Corp LP, College Station, TX). The internal validation was performed using R (version 2023.09.1 + 494).

Subgroup analyses

Absenteeism and presenteeism are large cost drivers for workers with LBP [30]. For this reason, separate analyses were performed based on retirement status: for pensioners (who do not have costs related to absenteeism and presenteeism), and participants who are active in the workforce (non-pensioners).

Post-hoc analyses

Based on the findings that NRS and costs seem to show a similar pattern, a Pearson's correlation test between pain severity (Numeric Rating Scale (NRS) 0–10) and total societal costs as well as health-related functioning and total societal costs at three months was done to statistically test these descriptive statistics.

Results

Participant characteristics

Figure 1 shows the flow chart of included participants in the BACE-C study, in which 284 people were eligible for participation. After exclusion of participants that did not consent or did not fill in any questionnaires, despite agreeing to do so, a total of 223 people were included in the study. The percentage of missing data ranged from 0 to 28% for included baseline variables, for which one variable (feelings of depression) was an extreme outlier in this case; i.e. 148 participants had complete data.

Table 1 shows the characteristics of all participants. The mean age of the participants was 66.4 years (standard deviation (SD) 7.6 years), of whom 42.3% described themselves as a pensioner. Of the 129 non-pensioners, 100 (77%) were younger than the retirement age of 67 years in the Netherlands. Of the 90 pensioners, 17 (19%) was younger than 67 years of age. The mean BMI was 26.6 (SD 4.7) and 82.1% was married or living with a partner. There was a slightly smaller proportion of females (46.6% vs 53.4% males). Of the participants, 88.6% did not smoke, and 54.6% drank alcohol on average more than twice per week. In total, 40.8% had a low-level education, 21.5% had moderate level education, and

37.7% had a high level of education. Almost all (94.6%) participants had the Dutch nationality. The top five comorbidities is neck/shoulder symptoms (55.2%), feet problems (28.3%), hip/knee arthritis (27.8%), high blood pressure (26.5%) and headache/migraine (17.9%). The median symptom duration was 122 days (interquartile range (IQR): 21–1095 days).

The group of participants in the 80% lowest costs (n=202) had overall similar characteristics to the group of all participants (Table 1). In the group of participants with the 20% highest healthcare costs (n=21), 66.7% were male, the average age was 60.4 years (SD:4.0), the average BMI was (27.8 (SD:4.0), and most people were non-smokers (87.8%). Back-specific functional status was higher (10.9, SD:6.5), as was the pain intensity (6.6, SD:2.1) in this group compared to the lowest cost group.

Of the 223 included participants, 90 participants were retired, 129 were not pensioned of which 98 participants had paid work. Of the working participants, 21 have experienced one or more days of sickness absence within the year after inclusion [median 17 days (IQR: 3–20)]. Eight of these participants exceeded the friction cost period. At each measurement moment, between 9 and 13 participants indicated to perform 100% at work. All other participants have indicated a level of presenteeism. Pensioners were on average 71.3 years(SD:5.9), 66.7% male, had a high percentage of non-smokers (93.9%), and had a high percentage of participants with an average alcohol consumption of four times per week or more (42.7%). Most pensioners had followed high level education (51.1%) and were married (78.9%).

Total annual societal costs

Table 2 gives an overview of the participants' aggregate and disaggregate costs. The mean total annual societal costs were \notin 5297 (95% CI 4191–6403). Presenteeism was the biggest cost driver, accounting for 66% of total societal costs. The cost distribution is shown in Appendix 3.

Participants were categorized as high-cost user (highest 20%) if their total annual societal costs were ≥€8694. The average total societal cost in the high-cost group was €22,595 (95% CI 17,255–27,935) and for the low-cost group €12,035 (95% CI 1937–2133).

Table 2 shows the average total societal costs for each follow-up period and aggregated for one year of follow-up. It shows relatively high presenteeism costs in the first three months, which slightly declines and stabilizes after three months. It is noteworthy that the high presenteeism costs for the first three months then declining and stabilising for the rest of the year follows a similar pattern to the NRS for pain intensity over the year. The NRS declines from 5.55 (scale 0–10) to 2.27 after three months and remains stable around 2 on a scale 0–10



Fig. 1 Flowchart of BACE-C cohort

Table 1 Characteristics of all participants, according to societal costs (high vs. low), and according to retirement status (non-pensioner vs. pensioner)

	All participants (n=223)	Missing n(%)	High costs (n=21)*	Low costs (n=202)	Non-pensioner (n = 129)	Pensioner (n = 90)
Age (years) [mean(SD)]	66.4 (7.6)	0 (0%)	60.4 (4.0)	66.9 (7.6)	63.0 (6.9)	71.3 (5.9)
Gender—female [n(%)]	104 (46.6%)	0 (0%)	7 (33.3%)	97 (48.0%)	71 (55.0%)	30 (33.3%)
BMI [mean(SD)]	26.6 (4.7)	0 (0%)	27.8 (4.0)	26.5 (2.7)	26.7 (4.6)	26.4 (4.8)
Smoking—yes [n(%)]	23 (11.4%)	21 (9%)	1 (4.8%)	22 (12.2%)	18 (15.0%)	5 (6.1%)
Average alcohol consumption [n(%)]						
Never	30 (14.8%)	20 (9%)	1 (4.5%)	29 (15.9%)	21 (17.4%)	9 (11.0%)
Once per month or less	28 (13.8%)	20 (9%)	4 (19.1%)	24 (13.2%)	18 (14.9%)	10 12.2%)
24 times per month	34 (16.8%)	20 (9%)	3 (14.3%)	31 (17.0%)	22 (18.2%)	12 14.6%)
2–3 times per week	46 (22.6%)	20 (9%)	7 (33.3%)	39 (21.4%)	30 (24.8%)	16 (19.5%)
4>4 times per week	65 (32.0%)	20 (9%)	6 (28.6%)	59 (32.4%)	40 (24.8%)	35 (42.7%)
Educational level [n(%)]						
Low	91 (40.8%)	0 (0%)	7 (33.3%)	84 (41.6%)	60 (46.5%)	29 32.2%)
Moderate	48 (21.5%)	0 (0%)	6 (28.6%)	42 (20.1%)	32 (24.8%)	15 (16.7%)
High	84 (37.7%)	0 (0%)	8 (38.1%)	76 (37.6%)	37 (28.7%)	46 (51.1%)
Marital status [n(%)]						
Single	32 (14.4%)	0 (0%)	3 (14.3%)	29 (14.4%)	16 (12.4%)	16 17.8%)
Married/living together	183 (82.1%)	0 (0%)	18 (85.7%)	165 (81.7%)	108 (83.7%)	71 78.9%)
LAT	8 (3.6%)	0 (0%)	0 (0.0%)	8 (3.9%)	5 (3.9%)	3 (3.3%)
Nationality [n(%)]	. ,	. ,	. ,		. ,	. ,
Dutch	211 (94.6%)	0 (0%)	21 (100%)	190 (94.1%)	120 (93%)	87 (96.7%)
Non-Dutch	12 (5.4%)	0 (0%)	0 (0%)	12 (5.9%)	9 (7%)	3 (3.3%)
Country of origin father [%/%]						
Dutch/non-Dutch	89.2%/10.8%	0 (0%)	95.2%/4.8%	88.6%/11.4%	89.1%/10.9%	88.9%/11.1%
Country of origin mother [%/%]						
Dutch/non-Dutch	92.4%/7.6%	0 (0%)	95.2%/4.8%	92.1%/7.8%	91.5%/8.5%	93.3%/6.7%
Employment						
(Self-)employed	98 (43.9%)	0 (0%)	18 (18.4%)	80 (81.6%)	NA	NA
Pensioner	90 (40.4%)	0 (0%)	0 (0.0%)	90 (100%)	NA	NA
Other (e.g. voluntary work)	31 (15.7%)	4 (1.8%)	3 (8.6%)	28 (91.4%)	NA	NA
Feelings of depression [n(%)]	10 (5.5%)	63 (28.0%)	0 (0.0%)	10 (6.3%)	6 (5.6%)	4 (5.4%)
Symptom duration in days (median (IQR)	121 (21–1095)	26 (12)	122 (28–1095)	61 (14–730)	122 (28–1095)	117 (21–730)
Comorbidities (N (%))**						
Neck/shoulders symptoms	101 (55.2%)	0 (0%)	11 (52.3%)	90 (44.6%)	59 (45.7%)	42 46.5%)
Feet problems	51 (28.3%)	0 (0%)	6 (28.6%)	45 (22.3%)	29 (22.5%)	22 24.4%)
Hip/knee arthritis	49 (27.8%)	0 (0%)	5 (23.8%)	44 (21.8%)	24 (18.6%)	25 27.8%)
High blood pressure	49 (26.5%)	0 (0%)	6 (28.6%)	43 (21.3%)	29 (22.4%)	20 (22.2%)
Headache/migraine	32 (17.9%)	0 (0%)	3 (6%)	29 (14.4%)	24 (18.6%)	8 (8.9%)
QALY [mean (SD)	0.4 (0.4)	23 (10)	0.3 (0.4)	0.4 (0.4)	0.3 (0.4)	0.4 (0.4)
Pain intensity [mean(SD)]	6.0 (2.2)	22 (10)	6.6 (2.1)	5.9 (2.2)	6.0 (4.6)	6.0 (2.1)
RMDQ [mean(SD)]	9.6 (5.8)	22 (10)	10.9 (6.5)	9.5 (5.7)	9.7 (5.9)	9.6 (5.6)

BMI Body Mass Index, QALY Quality Adjusted Life Years, RMDQ Roland Morrison Disability Index, SD Standard Deviation

*Participants categorized in high costs group were less than 20% due to missing data. Note: Percentages have been rounded off, hence values a bit less than 100% and a bit more than 100%

(Appendix 4). Most other costs categories remain stable over the period of one year (See Appendix 4). This

pattern is found in all groups (high- versus low-cost; and pensioners versus non-pensioners).

Table 2 Overview of the costs in Euros for people with low back pain in the BACE-C study (mean (95% Confidence Interval*))

		Medication costs	Primary healthcare costs	Secondary Healthcare costs	Absenteeism costs	Presenteeism costs	Unpaid productivity costs	Informal care costs	Total societal costs
All par- ticipants (N=223)	0–3 months	95 (39–151)*	131 (97–164)	72 (24–119)	96 (7–187)	1263 (874–1652)	32 (16–48)	66 (17–115)	1755 (1325– 2188)
	3–6 months	66 (17–116)	90 (63–118)	84 (50–117)	234 (52–418)	683 (422–945)	24 (9–40)	39 (10–69)	1220 (850–1594)
	6–9 months	180 (38–321)	75 (51–98)	86 (44–130)	75 (0–178)	824 (523–1124)	23 (11–36)	7 (0–20)	1270 (913–1625)
	9–12 months	76 (5–146)	50 (30–71)	97 (36–159)	54 (7–101)	705 (462–948)	155 (0–364)	24 (0–53)	1162 (823–1502)
	Total 12 months**	417 (183–651)	346 (283–411)	339 (230–449)	459 (128–766)	3475 (2523– 4427)	234 (25–446)	136 (31–212)	5297 (4191– 6403)
All partici- pants—high costs (N=21)	0–3 months	7 (0–14)	162 (69–255)	82 (0–214)	360 (0–890)	6568 (4131– 9008)	2 (0–7)	149 (0–424)	7330 (4628– 10,033)
	3–6 months	63 (0–173)	102 (42–161)	38 (0–91)	1381 (0–2813)	3975 (3416– 4533)	18 (0–41)	96 (0–214)	5672 (2941– 8403)
	6–9 months	54 (0–162)	80 (29–131)	137 (4–270)	565 (0–1678)	4833 (2671– 6994)	9 (0–24)	70 (0–217)	5747 (3336– 8159)
	9–12 months	56 (0–163)	72 (25–119)	58 (0–143)	263 (0–574)	3991 (2586– 5396)	16 (0–43)	52 (0–145)	4508 (2915– 6102)
	Total 12 months	181 (0–505)	415 (284–545)	314 (65–564)	1904 (244–3564)	19,368 (14,889– 23,846)	45 (7–84)	367 (6–728)	22,595 (17,255– 27,935)
All partici- pants—low costs (N=202)	0–3 months	106 (87–124)	128 (121–136)	68 (56–79)	77 (49–105)	782 (697–867)	36 (31–40)	59 (45–72)	1169 (1075– 1263)
	3–6 months	40 (30–50)	87 (81–93)	88 (81–95)	20 (4–35)	181 (153–210)	25 (21–29)	25 (18–31)	462 (423–500)
	6–9 months	111 (89–134)	74 (69–80)	84 (73–94)	4 (1–9)	159 (131–186)	27 (24–30)	0 (0–0)	494 (458–530)
	9–12 months	55 (38–72)	47 (43–51)	108 (94–121)	5 (0–9)	155 (130–181)	68 (40–95)	9 (5–14)	427 (391–463)
	Total 12 months	427 (347–508	337 (322–353)	350 (321–379)	203 (148–258)	1820 (1644– 1995)	262 (188–336)	114 (91–137)	2035 (1937– 2133)
Non- pensioners (N=129)	0–3 months	92 (30–155)	132 (90–174)	51 (1–99)	168 (12–323)	2162 (1532 – 2793)	29 (8–50)	48 (0–101)	2681 (1991– 3372)
	3–6 months	62 (1–123)	76 (44–108)	85 (38–132)	406 (91–721)	1175 (740–1610)	23 (5–40)	26 (0–57)	1852 (1238– 2466)
	6–9 months	184 (0–396)	74 (48–101)	67 (19–115)	130 (0–308)	1416 (919–1914)	18 (1–35)	11 (0-34)	1902 (1321– 2482)
	9–12 months	70 (0–164)	44 (20–69)	65 (0–137)	94 (13–174)	1185 (793–1576)	52 (0–124)	12 (0–36)	1521 1082–1961)
	Total 12 months	409 (137–680)	326 (247–406)	268 (148–387)	599 (225–974)	5939 (4427– 7449)	121 (44–198)	97 (23–171)	7759 (6047– 9470)
Pensioners (N=90)	0–3 months	103 (0–211)	131 (87–174)	67 (25–110)	0 (0–0)	0 (0–0)	38 (14–61)	95 (4–186)	464 (269–659)
	3–6 months	75 (0–167)	106 (67–145)	78 (41–115)	0 (0–0)	0 (0–0)	27 (3–51)	42 (0-84)	338 (207–469)
	6–9 months	174 (9–339)	72 (42–102)	116 (49–183)	0 (0–0)	0 (0–0)	32 (13–51)	0 (0–0)	406 (217–594)
	9–12 months	87 (0–196)	60 (32–89)	136 (54–217)	0 (0–0)	0 (0–0)	310 (0-825)	42 (0–107)	684 (134–1234)
	Total 12 months	439 (3–876)	370 (281–458)	398 (237–558)	0 (0–0)	0 (0–0)	407 (0–921)	179 (29–329)	1892 88–2695)

*Based on the study of Nixon et al. (2010), using Monte Carlo simulations, the authors showed that, even when data were highly skewed, both a normal-based method (e.g. OLD) and non-parametric bootstrapping accurately estimated the true standard errors (SEs), and hence 95%Cis, when sample sizes were moderate to large (*n* > 50), also gave good estimates for small data sets with low skewness

**Total values are depicted in bold font. 95% CI: Confidence Interval. Costs are presented in euros 2021

	Coefficient (regression)	SE (of regression coefficient)	p value	Odds ratio	95% CI
Age*	-0.14	0.04	0.002	0.87	0.80-0.95
Gender*	1.09	0.47	0.020	2.96	1.19–7.44
Alcohol intake*	-0.72	0.45	0.114	0.49	0.20-1.19
Retirement status*	2.24	0.83	0.007	9.37	1.83–48.04
Back-related functioning*	0.07	0.4	0.040	1.08	1.00-1.16

Table 3 Multivariate model using the top 20th percentile of societal costs as an outcome (total population)

*Age: Continuous. Gender: 0-female, 1-male. Alcohol intake: alcoholic drinks per day (1–10). Retirement: 0 = Pensioner; 1 = non-pensioner. Back-related functioning: functioning at baseline (Roland Morrison Disability Questionnaire 0–24)

Table 4 Multivariate model using the top 20th percentile of societal costs as an outcome (non-pensioners)

	Coofficient	SE (of regression	n valua	Odde vatio	050/ 01
	(regression)	coefficient)	<i>p</i> value	Odds ratio	95% CI
Gender*	1.28	0.56	0.023	3.60	1.19–10.87
Alcohol intake*	- 1.07	0.59	0.07	0.34	0.11-1.10
Age*	-0.11	0.05	0.028	0.89	0.80-0.99
Back-related functioning*	0.10	0.05	0.025	1.10	1.01-1.21

* Age: Continuous. Gender: 0-female, 1-male. Alcohol intake: alcoholic drinks per day (1–2, 2–4, 5–6, 7–9). Back-related functioning: functioning at baseline (Roland Morrison Disability Questionnaire 0–24)

Table 2 also gives an overview of the average societal costs the pensioners and non-pensioners with low back pain in the BACE-C study made in one year. Total mean annual societal costs were 7759 (95% CI 6047–9470) for the non-pensioners. All pensioners were categorised in the low-cost group, largely due to the lack of absentee-ism and presenteeism costs. The total mean societal costs for the group of low costs pensioners were 2035 (95% CI 1937–2133).

Prediction of total societal costs

Using the top 20th percentile of societal costs as an outcome, the predictive factors for high societal costs in the total population were younger age (OR 0.87 for each additional year; 95% CI 0.80–0.95), being male instead of female (OR 2.96; 95% CI 1.19–7.44), lower alcohol intake (OR 0.49 for each increase category of alcoholic intake; 95% CI 0.20–1.19), working instead of retirement (OR 9.37; 95% CI 1.83–48.04) and more back-related functional disability at baseline (OR 1.08 for each additional point on the RMDQ; 95% CI 1.00–1.16) (Table 3).

The Hosmer–Lemeshow statistic was not significant $(X^2=6.27 \text{ p}=0.62)$, indicating that the model's overall fit was good. The model explained 28.2% (Nagelkerke's \mathbb{R}^2) of the variation in the outcome (i.e. high societal costs) and the model's AUC was 0.86 (Table 5).

After internal validation, the model's explained variance reduced to 35.7 and the AUC to 0.84. Table 5 Summary of performance of predictive models

	Hosmer Lemeshow test (p value)	Area under ROC curve	Nagelkerke R ²
Total sample (N = 223)	6.271 (0.62)	0.8578	0.2818
Non-pensioners (N = 129)	6.282 (0.83)	0.7667	0.149

Sensitivity analysis: prediction of societal costs for the non-pensioners

Using the top 20th percentile of societal costs as an outcome in the non-pensioners, the predictive factors for high societal costs were younger age (OR 0.89 for each additional year; 95% CI 0.80–0.99), being male (OR 3.60; 95% CI 1.19–10.87), lower alcohol intake (OR 0.34 for each increase category of alcoholic intake; 95% CI 0.11–1.10) and more back-related functional disability at baseline (OR 1.10 for each additional point on the RMDQ; 95% CI 1.01–1.21) (Table 4).

The Hosmer–Lemeshow statistic for the total sample was not significant ($X^2 = 6.28 \text{ p} = 0.83$), indicating that the model's overall fit was good. The model explained 14.9% (Nagelkerke's \mathbb{R}^2) of the variation in the outcome (i.e. high societal costs) and the model's AUC was 0.77 (Table 5).

After internal validation, the model's explained variance reduced to 26.5 and the AUC to 0.77.

Prediction of societal costs for the pensioners

Due to the low total societal costs and lack of variability in healthcare and informal care costs, we did not find any predictive factors for high costs for the pensioners. An overview of the univariate analyses, showing none of the potential predictive factors had a p value < 0.02 is included in Appendix 5.

Post-hoc analysis: Correlation between pain severity and costs at three months

A Pearson's correlation test between pain severity, and total costs at three months, showed a correlation of 0.10 between pain severity and total societal costs (no correlation), and a correlation of 0.12 between pain severity and healthcare costs.

Discussion

Main findings

The first aim of this study was to estimate the annual societal costs made by older adults with LBP seeking chiropractic care due to a new episode of LBP. The mean total annual societal costs per patient was €5297 (95% CI 4191-6403). Most of these costs comprised of presenteeism and absenteeism costs. Participants categorised in the 20% highest costs group had an average of €22,595 (95% CI 17,255-27,935), whereas participants categorised in the lowest 80% cost group had an average of €2035 (95% CI 1937-2133). Predictors for total societal costs were retirement status, age, gender, alcohol intake, and back-related functioning. Retirement status emerged as the strongest predictor, leading us to divide the cohort into pensioners and non-pensioners to explore societal costs and relevant predictors for participants with a highcost pattern.

The non-pensioners' total societal costs mainly consisted of absenteeism and presenteeism costs (mean €7579 (95% CI 5877–9281), whereas the pensioners' total societal costs were €1754 (95% CI 1010-2499). For the non-pensioners, gender, age, alcohol intake, and backrelated functioning were predictors of being in the 20% highest cost category. In the Netherlands, males generally tend to have a higher income compared to women [31], which explains why they have higher absenteeism costs and therefore higher societal costs. Secondly, in this elderly population, having a younger age means that these people are still working, which is related to higher societal costs. The predictive value of alcohol intake is more difficult to understand. An explanatory factor might be that lower alcohol intake is related to healthier people, which is associated to less costs. This could, however, be a spurious finding, and would need to be corroborated by other more robust studies. Finally, as expected,

participants with a worse back-related functioning have a higher likelihood to be in the high cost group. Interestingly, pain score was not related to the costs while they tend to follow the same pattern. A Pearson's correlation test between pain and costs (healthcare and total costs) showed no correlation. This could potentially be explained by the fact that pain might be less relevant than functional status for someone's ability to work.

All pensioners were in the lowest cost-category. It was impossible to predict high costs for the pensioners, due to low variability in their costs. Even when using the top 20% of highest costs within the group of non-pensioners, high costs could not be predicted for this group.

The model's overall fit was good, with an explained variance (28.2%). The AUC was 0.86, indicating good interpretability. Internal validation had minimal effect on the model's performance suggesting a low risk of overfitting.

Comparison to the literature

Direct comparability of this study with other studies is limited, as few studies on costs related to LBP and, as far as we are aware, no similar study among older adults visiting chiropractic practices/study with a similar population and in a similar setting have been conducted in the Netherlands. Therefore, the Dutch results can be considered informative for other European countries, but a direct comparison is not possible [32–34].

The mean societal costs of this study were \notin 5297 per patient for the first year after contacting a chiropractor, resembling a similar Dutch study by Mutubuki et al. (2020), reporting \notin 5522 [5]. In the current study, participants were categorized as high-cost user (highest 20%) if their total annual societal costs were \geq €8694. In the study of Mutubuki et al. (2020) [5] costs at different cut-off points were as follows: 20% (\geq €7906), 10% (\geq €11,922), and 5% (\geq €19,403).

Dutmer et al. (2019) [35] reported higher costs of €9000 per patient. This discrepancy is like explained by variations in healthcare system structures, patient settings and/or differences in cost estimations (administrative data versus self-reporting for example). Killingmo et al. [32] in a similar Norwegian cohort reported mean costs of €825 (682–976) per year per patient related to healthcare utilisation. Costs related to healthcare utilisation in this cohort (medication costs, primary and secondary healthcare) would add up to €1102 in one year, which is relatively comparable to the cohort of Killingmo. This is higher than the healthcare direct healthcare costs per patient for a recent Dutch study about general practitioner-guided care in patients with musculoskeletal complaints by Pellekooren et al. of €97 [32]. Even though the study of Pellekooren focused on a population similar to this study, their focus was on general practitioner-guided

care costs only (instead of total societal costs) in patients with a broad range of musculoskeletal complains.

Few studies have investigated predictive factors for high societal costs among people with LBP. Gender, being male, found as a predictive factor for high societal costs in the current study, was also found in other studies [5, 34]. Other studies also found different predictive factors compared to those found in the current study, such as pain persistence, mental health issues, including high pain scores and comorbidities [6, 14, 15, 34-36]. A possible explanation for the differences found in predictive factors is that the studies took place in different healthcare settings in different countries with different insurance packages and different availability of primary and secondary healthcare. Comparing the outcome of this study with possible similar studies set in different countries is likely to be limited due to different ways of financial registration of healthcare costs in different countries as well [36].

Strengths and limitations study

This study is the first to investigate societal costs and predictive factors in chiropractic patients aged 55 years or older with LBP in the Netherlands. Mapping societal costs and predictive factors is vital to decrease the use of scarce healthcare resources and reduce the burden on our healthcare systems [37]. The use of advanced methodology for handling missing data and performing prediction models enhances the study's reliability.

A limitation of this study is the possible underestimation of total healthcare utilisation and related costs due to using self-reported outcome measures. Self-reports tend to underestimate the true value of healthcare utilisation due to potential recall bias [38]. However, in the Netherlands administrative data for healthcare measures is practically inaccessible and for that reason we used self-reported data. On the other hand, presenteeism was self-reported, which might have resulted in an overestimation of these costs. That is, VAS-based presenteeism scales are prone to end-aversion bias [39], meaning, individuals to avoid extreme choices and select a choice in the middle of the scale. Consequently, participants might have underreported their productivity at work, which in turn led to overestimated presenteeism costs. Despite the above-stated limitations, this is the recommended method as there are no registers on healthcare-related costs available in the Netherlands, nor objective measures of work performance.

A second limitation is the potential overestimation of societal costs attributed to LBP for participants who have reported one or multiple comorbidities. Over half of the participants reported to have one or multiple comorbidities. These comorbidities might have contributed to their societal costs, while not directly relatable to their LBP, resulting in a potential overestimation of cost attributed to LBP. A recent Canadian study concluded that people identified as having chronic pain have a higher prevalence of comorbidities and use significantly more publicly funded health services [40].

A third limitation is the missing data, which is related to the use of self-reported outcomes. It is well-known that healthcare utilisation is prone to missing data and that missing values should be replaced to make use of all reported data. Multivariate imputation by chained equations has been used to handle the missing data, thereby avoiding complete-case analysis which would have significantly reduced the power of these findings and potentially introduced information bias due to selective drop-out of participants [27]. This is the preferred statistical method for dealing with missing data, particularly when costs are involved [41, 42].

Another limitation is the small sample size. The focus on people who visited the chiropractor led to a selection of a relatively narrow group of participants. However, we consider this a strength of this study as information on predictors for costs in this population is lacking, whereas exploring the mechanisms related to high-cost users could potentially lead to implementation initiatives or modification of policy aimed at reducing costs. The selection of patients should be considered when generalizing our results. Secondly, the limited sample size limited us in exploring different cut-off point for high costs. Secondly, using more explanatory trajectory analyses (e.g. sequence analysis) were not possible. As this is an exploratory study and the first study ever done evaluating the costs in this population, the outcome is valuable as an indication for further research. Despite these limitations, the study provides valuable insights and serves as a foundation for future research.

Implications for research and practice

This study recommends separating pensioners from nonpensioners in future research, given the differences in cost patterns and predictors. Establishing a consensus on cut-off points for high costs would enhance comparability with existing literature. Understanding the mechanisms associated with identified predictors for high societal costs is crucial for facilitating cost reductions.

This is an exploratory study, of which the importance is to emphasize the need to study older adults with chronic LBP. While this study will not have direct implications for daily clinical practice, it could influence guideline commissions who are confronted with costs for people with LBP who continue to work or are retired to offer targeted interventions to prevent, a decline in health status and subsequent influence on their work status and substantial avoidable costs.

Conclusion

This study estimated the mean annual societal cost to be \notin 5297 (95% CI 4191–6403). Most costs were made in the first 3 months, slightly declined, and remained stable for the rest of the year. "Working" emerged as the main predictor of high costs in this population of older adults. Future studies focusing on older adults should explore pensioners and non-pensioners separately, delving into the mechanisms associated with identified predictors for high societal costs to facilitate effective cost reductions.

Abbreviations

The back complaints in elderly-chiropractic study
Low back pain
95% Confidence interval
Odds ratio
Body Mass Index
Quality adjusted life years
Roland Morrison Disability Index
Standard deviation
Area under the receiver operating characteristics curve
Numeric Rating Scale
Global perceived effect

Supplementary Information

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Additional file 1.		
Additional file 2.		
Additional file 3.		
Additional file 4.		
Additional file 5.		

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Author contributions

EM and BvdV drafted the manuscript. SR, JvD, and AJ critically reviewed the manuscript. All authors read and approved the final manuscript.

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Availability of data and material

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

Declarations

Ethical approval and consent to participate

Medical Ethics Committee of the Vrije University Medical Center, the Netherlands ethics number 2017–618.

Consent for publication

Written informed consent from all participants was obtained. A copy of the consent form is available for review by the Editor of this journal

Competing interests

Not applicable.

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