ORIGINAL INVESTIGATION



Relationship of frailty status with health resource use and healthcare costs in the population aged 65 and over in Catalonia

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Abstract

Background Frailty is a geriatric syndrome with repercussions on health, disability, and dependency.

Objectives To assess health resource use and costs attributable to frailty in the aged population.

Methods A population-based observational longitudinal study was performed, with follow-up from January 2018 to December 2019. Data were obtained retrospectively from computerized primary care and hospital medical records. The study population included all inhabitants aged ≥ 65 years ascribed to 3 primary care centres in Barcelona (Spain). Frailty status was established according to the Electronic Screening Index of Frailty. Health costs considered were hospitalizations, emergency visits, outpatient visits, day hospital sessions, and primary care visits. Cost analysis was performed from a public health financing perspective.

Results For 9315 included subjects (age 75.4 years, 56% women), frailty prevalence was 12.3%. Mean (SD) healthcare cost in the study period was \notin 1420.19 for robust subjects, \notin 2845.51 for pre-frail subjects, \notin 4200.05 for frail subjects, and \notin 5610.73 for very frail subjects. Independently of age and sex, frailty implies an additional healthcare cost of \notin 1171 per person and year, i.e., 2.25-fold greater for frail compared to non-frail.

Conclusions Our findings underline the economic relevance of frailty in the aged population, with healthcare spending increasing as frailty increases.

Keywords Health resource use \cdot Healthcare costs \cdot Frailty \cdot Population ageing \cdot Hospitalizations \cdot Primary care visits \cdot Emergency visits \cdot Outpatient visits

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Introduction

Population ageing is a reality of concern in most developed countries. Frailty is a major and well-known clinical condition associated with ageing, characterized by a decrease in the body's functional reserves and in its ability to respond to external stressors (Morley et al. 2013). Because of the impaired functioning of various organs and systems, frail subjects are at increased risk of disease, adverse health outcomes, functional decline, falls, fractures, disability, and dependency (Lahousse et al. 2014). Prevalence of frailty in the population aged \geq 65 years is about 11%, but greatly increases with age (Collard et al. 2012; Garcia-Garcia et al. 2011; Jürschik et al. 2012). In a context of an ageing population, frailty represents a huge potential public health burden (Ilinca and Calciolari 2015). For individuals, it implies a greater risk of adverse health outcomes, reduced autonomy, and decreased quality of life and, for society, it implies an increase in health and social resource use and the corresponding increase in expenditure.

Ageing increases demand for healthcare services and costs (Alemayehu and Warner 2004; Dios-Guerra et al. 2021; Vela et al. 2019), and frailty has been associated with an increased use of primary care, hospital, and community services (Hoeck et al. 2012; Ilinca and Calciolari 2015). Several scientific literature has addressed the cost of frailty from different perspectives. Some studies have considered health care resource use and costs related to frailty in specific clinical conditions or in specific group of patients such as hospitalized patients with heart failure (Kwok et al. 2020), surgical patients (Eamer et al. 2019), or cardiac implanted patients (Patel et al. 2020; Mohamed et al. 2019). Other studies only considered costs of hospital care (Liotta et al. 2019; García-Nogueras et al. 2017) or only costs of ambulatory health care (Sirven and Rapp 2017) and others assessed the cost-effectiveness or cost-utility of interventions addressing frailty (Yokoyama et al. 2020; Li et al. 2020; Bleijenberg et al. 2017; Peña-Longobardo et al. 2021). Few studies evaluated cost of frailty in the community. They are from different countries such as USA (Ensrud et al. 2020; Johnston et al. 2020), China (Gao et al. 2021; Fan et al. 2021), England (Han et al. 2019), Germany (Hajek et al. 2018a, b) or Mexico (Salinas-Escudero et al. 2022), and despite the heterogeneity in their settings, designs, perspectives, cost elements considered, or applied rates, they all suggest an increase in health care expenditure according to frailty severity. A systematic review and meta-analysis about healthcare costs associated to frailty in community-dwelling aged population incorporating 5 original articles found a dose-response relationship between frailty severity and healthcare resource use and costs, but also conclude that further research is needed (Kojima 2019). What studies have been done confirm that frail subjects are the main consumers of health resources, that frailty greatly increases healthcare expenditure (Hajek et al. 2018a, b; Liotta et al. 2019; Martínez-Reig et al. 2018; Sirven and Rapp 2017), and also that healthcare costs are very context dependent. As far as we are aware, there is only one study in Spain assessing additional costs attributed to frailty (the FRADEA study) (García-Nogueras et al. 2017). As mentioned, this study only consider hospital costs but not ambulatory costs. To date, therefore, the cost of frailty in the Spanish setting is not well known. This study aims to assess hospital and ambulatory health resource use by general elderly population according to frailty status, and to estimate additional healthcare costs attributable to frailty.

Material and methods

Study design and population

A population-based observational retrospective cohort study was designed with follow-up from 1 January 2018 to 31 December 2019. Data were retrospectively obtained from computerized primary care and hospital medical records. The study population included all inhabitants aged ≥ 65 years ascribed to 3 primary care centres in the province of Barcelona (Catalonia, Spain). The study protocol was approved by the local ethical committee for clinical research.

Study variables and data source

Frailty status was established according to the Electronic Screening Index of Frailty (e-SIF) (Serra-Prat et al. 2022), which includes the following clinical conditions: arthritis, atrial fibrillation, stroke, chronic renal failure, diabetes, heart failure, visual alterations, arterial hypertension, hypotension or syncope, coronary heart disease, dementia, osteoporosis or frailty fractures, Parkinson or neurodegenerative diseases, dyspepsia or gastroesophageal reflux disease, peripheral arterial disease, chronic lung disease, cutaneous ulcer, sleep disorders, inflammatory bowel disease or malabsorption, chronic liver disease, depression, sarcopenia, cachexia or muscular weakness, active cancer, psychosis, HIV infection, dysphagia, obesity, chronic pain, anaemia, weight loss in the last 6 months, anorexia or malnutrition, urinary or faecal incontinence, dyspnoea or fatigue, physical limitation or disability, dizziness or altered balance, falls in the last year, confinement or institutionalization, functional dependency or transfer problems, alcohol dependence, social vulnerability, polypharmacy, urgent admission in the last year with > 2 hospital days and age > 80 years. The e-SIF score is calculated by adding the clinical conditions present in a given time and is interpreted as follows: 0 to 4 as robust, 5 to 8 as pre-frail, 9 to 11 as frail and \geq 12 as very frail. e-SIF was calculated for data corresponding to 1st of January 2018. Data were collected on institutionalization, planned and unplanned hospitalizations, major outpatient surgery hospitalizations, emergency visits, day hospital sessions, outpatient visits, and primary care visits, for both the study period (2018-2019) and the date of the event. The data used to calculate the e-SIF score were sourced from the primary care computerized medical history (e-CAP) for each subject, the pharmaceutical receipt database, and the hospital information system (HIS) of the reference hospital for the participating primary care centres. Data on age, sex, and health resource use during study period were obtained from e-CAP and HIS clinical records.

Cost analysis

The cost analysis was performed from a public health financing perspective, in this case, for the Catalan Health Service (CatSalut). The cost elements considered were hospitalizations (planned, unplanned, and due to major outpatient surgery), emergency visits, day hospital sessions, outpatient visits, and primary care visits. Unit healthcare costs were obtained from public cost accounting contracts with Cat-Salut for primary and specialized acute care provision, published on the official CatSalut website (CatSalut). Cat-Salut establishes 2 charging methods: a unit cost per hospitalization, emergency visit, and day hospital session, and an annual budget based on morbidity, territorial and demographic factors for outpatient and primary care visits. Unit costs were obtained as follows: (a) for hospitalizations, the weighted average of the medical and surgical hospitalization costs according to real medical and surgical discharges in the year of study; (b) for emergency visits, the sum of the unit cost per visit and an additional established triage cost; (c) for day hospital sessions, as set out in the contract terms; (d) for outpatient visits, the annual budget divided by the real annual number of visits as obtained from the transparency portal annual report of the reference hospital (CSdM); and (e) for primary care visits, the annual budget of each primary care centre divided by the real annual number of visits, averaged for the 3 primary care centres participating in the study. Costing was as follows: €2147.82 per hospitalization, €210.0 per day hospital session, €107.71 per emergency visit, €56.42 per outpatient visit, and €19.59 per primary care visit. Finally, the total health cost was calculated as the sum of costs for hospitalizations, emergency visits, day hospital sessions, outpatient visits, and primary care visits.

Statistical analysis

Frailty groups (robust, pre-frail, frail, and very frail) were compared for health resource use and health expenditure using the Kruskal–Walllis test (when considering all 4 frailty groups) and the Mann–Whitney U Test (when considering frail vs. non-frail categories). Percentage of attended subjects were compared using the Chi-square test. The effect of frailty on being attended to each of the health resources considered was evaluated using bivariate (unadjusted) and multivariate (adjusting for age and sex) logistic regression. The incremental cost of each frailty level in comparison to the previous frailty level was calculated using bivariate and multivariate lineal regression analysis (LRA), adjusting for age and sex. The incremental cost of frailty (frail vs. nonfrail) was also calculated using bivariate and multivariate LRA. Statistical significance was established at P < 0.05.

Results

A total of 9315 subjects were included in the analysis, mean (SD) age 75.4 (7.96) years, and 56% women. Frailty prevalence overall was 12.3%, with 52.8% of the study population considered as robust, 34.9% as pre-frail, 9.8% as frail and 2.5% as very frail. Frailty prevalence was 10.04% in men and 14.11% in women (P < 0.001) and increased progressively with age, rising from 3.2% for the 65–69 age bracket to 25.8% for the \geq 95 age bracket (P < 0.001). Description of main characteristics of study population is presented in Table 1.

Comparison of percentage of attended subjects between frail and non-frail and the unadjusted and adjusted effect of frailty on being attended at least once to each of the health resources considered is presented in Table 2. It shows a significant higher percentage of attended subjects in the frail group for all health resource considered, and an adjusted effect of frailty on all health resources considered except for institutionalization. Table 3 shows the average number of unplanned hospitalizations, planned hospitalizations, major outpatient surgeries, emergency visits, day hospital sessions, outpatient visits, and primary care visits per subject by frailty status, sex, and age for the period 2018-2019. Men used all services, except for primary care, more frequently than women. The rate of hospitalizations, emergency visits, and primary care visits for subjects aged > 80 years almost doubled that of subjects aged < 80 years. As frailty progressed, mean health resource use increased proportionally and significantly. Table 4 shows healthcare costs by frailty group. Higher frailty scores were associated with increased healthcare spending. Table 5 summarizes the bivariate and multivariate LRA results for the incremental cost attributed to frailty adjusted by age and sex. The progression from one frailty status to the next carries a €1392.21 increase in healthcare cost expenditure when adjusted by age and sex.

Table 1	Description of main
characte	eristics of the study
populat	ion

Clinical condition	Percentage	Clinical condition	Percentage
Arterial hypertension	52.56	Cancer	10.69
Polypharmacy	46.03	Dyspepsia	10.23
Arthritis	35.32	Social risk	9.82
Obesity	33.76	Chronic renal failure	7.64
Sleep disorders	21.56	Heart failure	3.95
Chronic lung disease	20.55	Dementia	3.32
Diabetes	19.29	Stroke	2.65
Depression	16.48	Neurodegenerative disease	0.98

	% of attended in non-frail	% of attended in frail	р	Unadjusted OR (95% CI)	Adjusted OR* (95% CI)
Unplanned hospitalization	12.86	38.82	< 0.001	4.30 (3.76–4.92)	3.20 (2.76–3.70)
Institutionalization	4.60	11.05	< 0.001	2.57 (2.08-3.18)	1.09 (0.87–1.37)
Emergency visit	45.79	74.67	< 0.001	3.49 (3.04-4.02)	2.88 (2.49-3.34)
Outpatient visit	64.46	86.07	< 0.001	3.41 (2.87-4.05)	3.62 (3.02-4.34)
Day hospital session	9.94	25.24	< 0.001	3.06 (2.63-3.56)	2.76 (2.35-3.25)
Primary care visit	93.41	98.96	< 0.001	6.68 (3.76–11.88)	7.42 (4.15–13.27)

 Table 2
 Relationship between frailty and use of different health care resources (attended at least once)

*Adjusted by age and sex

Similarly, when considering only the frail versus non-frail categories, the multivariate LRA (adjusted for age and sex) shows an increased cost of \notin 2342.58 attributable to frailty. The multivariate LRA also points to an independent effect of age and sex on healthcare costs. In the model that considers 4 frailty status categories, the interaction between age and sex did not reach statistical significance (p = 0.066), but in the model that considers frailty in two categories, a significant interaction was observed between age and sex (p = 0.034) on healthcare costs.

Figure 1 depicts total healthcare cost according to frailty groups. The hospitalization cost progressively contributed more to the total cost as frailty increased. While in the robust population hospital admissions represented 47.7% of the overall cost, this percentage raised to 58.7% in the very frail population.

Discussion

Our findings confirm that frailty progression increases health resource use and that frailty increases healthcare costs by 125%, mainly due to hospitalizations. This represents an additional annual healthcare cost of approximately 1170€ per frail person compared to a non-frail person in our context. These results are similar to those reported by other authors in recent years. García-Nogueras et al. (2017) found, for the Albacete region of Spain, that pre-frail and frail patients cost €458 and €592 more, respectively, in total annual healthcare costs compared to robust patients. Sirven and Rapp (2017) showed, for France, that the incremental cost for ambulatory health expenditure was roughly €750 and €1500 for pre-frail and frail individuals, respectively. Although costs are context-specific and so may greatly vary between countries and healthcare financing systems, it can be generally agreed that healthcare costs are approximately 2.5-fold greater for frail individuals compared to non-frail individuals. Moreover, frailty has associated social costs due to dependency and disability that are not usually considered in these studies.

We found that older age groups were associated with higher frailty prevalence and with higher health resource use and cost, so age could act as a confounder when assessing cost of frailty. However, multivariate analysis showed an effect of frailty on healthcare costs independent from age and sex. Although frailty was more prevalent in women than in men, women used fewer health resources and ,consequently, had lower healthcare costs, with the multivariate LRA confirming the independent effect of sex on healthcare costs. Our results corroborate those of other studies conducted in the USA, India, and Spain (Cameron et al. 2010; Carretero et al. 2014; Mondal and Dubey 2020; Redondo-Sendino et al. 2006; Dalmau-Bueno et al. 2021), which have reported, adjusting by age and morbidity, lower health care expenditure and health care services use for women than men. We found, corroborating other Spanish studies (Aguado et al. 2012; Dios-Guerra et al. 2021), that the only service used more by women than men was primary care. Our findings are suggestive of gender inequality in health resource use. Causes of gender inequalities in healthcare use are complex and poorly understood. They may be related with socioeconomic status (women receive lower incomes) and social environment (twice as many women live alone as men), among others factors, and require to be further studied.

This study's findings have 3 major implications for public policy. First, prevention-oriented interventions, mainly from the primary care setting, should play a key role in reducing the personal, social, and economic impact of frailty. Frailty, especially in its initial phases, is a preventable, reversible, and treatable condition (Cameron et al. 2013; Gill et al. 2006; Ng et al. 2015; Serra-Prat et al. 2017). More than a third of the population aged over > 65 year is classified as pre-frail, and are at an increased risk of becoming frail. Pre-frailty interventions for frailty prevention are both easier and more effective than frailty interventions to reverse this condition, so screening and intervention programmes for the pre-frail group would probably lead to greater reduction in health resource use and cost and would be more efficient

Table 3 H ₆	salthcare resour	ce use by fr	ailty status, sex,	and age gro	oup 2018–2019	-								
	Unplanned hos tions	spitaliza-	Planned hospi	italizations	Major outpatic surgeries	ent	Emergency vi	isits	Outpatient visits		Primary care	e visits	Day hospital se	ssions
	Mean (95% CI)	Р	Mean (95% CI)	Р	Mean (95% CI)	P d	Mean (95% CI)	Р	Mean (95% F CI)		Mean (95% CI)	Р	Mean (95% 1 CI)	0
Robust	0.114 (0.10– 0.13)	< 0.001	0.091 (0.08–0.10)	< 0.001	0.092 (0.08–0.10)	< 0.001	0.761 (0.72–0.80)	< 0.001	4.743 (4.50–5.00)	< 0.001	17.499 (17.03– 17.97)	< 0.001	0.418 (0.32–0.51)	< 0.001
Pre-frail	0.304 (0.28– 0.33)		0.180 (0.16–0.20)		0.149 (0.13–0.17)		1.365 (1.30–1.43)		8.564 (8.18–8.95)		33.670 33.670 (32.77– 34.57)		0.932 (0.72–1.14)	
Frail	0.564 (0.50– 0.63)		0.257 (0.21–0.31)		0.145 (0.12–0.17)		2.108 (1.94–2.27)		11.582 (10.67–12.49)		52.229 (49.81– 54.65)		1.053 (0.82–1.29)	
Very frail	0.850 (0.70– 1.10)		0.408 (0.28–0.53)		0.163 (0.10–0.23)		2.935 (2.53–3.34)		11.579 (9.78–13.38)		59.910 (55.28– 64.53)		1.983 (1.17–2.79)	
Male	0.299 (0.27– 0.32)	< 0.001	0.176 (0.16–0.19)	< 0.001	0.118 (0.10–0.13)	0.735	1.229 (1.17–1.29)	0.036	7.868 (7.50–8.23)	< 0.001	25.313 (25.53– 27.09)	< 0.001	0.914 (0.75–1.08)	< 0.001
Female	0.200 (0.18– 0.22)		0.123 (0.11–0.13)		0.121 (0.11–0.13)		1.103 (1.06–1.15)		6.184 (5.92–6.44)		28.622 (27.88– 29.36)		0.532 (0.42–0.64)	
<80 y	0.165 (0.15– 0.18)	< 0.001	0.121 (0.11–0.13)	< 0.001	0.126 (0.12–0.14)	0.005	0.993 ($0.95-1.03$)	< 0.001	7.151 (6.88–7.42)	0.387	24.039 (23.51– 24.57)	< 0.001	0.679 (0.57–0.78)	< 0.001
≥80 y	0.426 (0.39– 0.46)		0.205 (0.18–0.23)		0.103 (0.09–0.12)		1.541 (1.46–1.62)		6.379 (6.02–6.74)		35.922 (34.66– 37.18)		0.745 (0.55–0.94)	
Overall	0.243 (0.23– 0.26)		0.146 (0.14–0.16)		0.119 (0.11–0.13)		1.158 (1.12–1.20)		6.919 (6.70–7.14)		27.612 27.612 (27.07– 28.15)		0.699 (0.60–0.79)	

Total cost	1	Unplanned ho zations	spitali-	Planned hospitaliza- tions	Major outpatient surgeries	Emergen	cy visits	Outpatient v	isits	Primary care	visits	Day hospital s	essions
Mean (SD) P Mean (SD) P Mean (SD)	Mean (SD) P Mean (SD)	Mean (SD)	Mean (SD)	Ρ	Mean (SD) P	Mean (SD)	Ρ	Mean (SD)	Ρ	Mean (SD)	٩.	Mean (SD) P	
$\begin{array}{rrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrr$	$\begin{array}{rcl} 11 & 245.83 & < 0.001 & 195.61 \\ (993.6) & & (827.0) \end{array}$	<0.001 195.61 (827.0)	195.61 (827.0)	< 0.00	1 198.67 <0. (769.3)	001 81.94 (150.3)	< 0.001	276.65 (493.4)	< 0.001	342.80 (328.9)	< 0.001	87.69 (721.8)	< 0.001
2845.51 653.54 385.64 (3531.9) (1609.8) (1159.7)	653.54 385.64 (1609.8) (1159.7)	385.64 (1159.7)	385.64 (1159.7)		320.82 (1027.3)	146.99 (205.5)		483.16 (631.6)		659.60 (509.9)		195.77 (1264.7)	
4200.05 1212.25 551.02 (4275.8) (2083.7) (1632.7)	1212.25 551.02 (2083.7) (1632.7)	551.02 (1632.7)	551.02 (1632.7)		311.86 (935.8)	227.06 (276.6)		653.45 (791.4)		1023.17 (731.9)		221.23 (767.6)	
5610.73 1825.19 875.72 (4823.0) (2473.7) (2083.3)	1825.19 875.72 (2473.7) (2083.3)	875.72 (2083.3)	875.72 (2083.3)		350.29 (1108.6)	316.20 (334.1)		653.31 (786.7)		1173.63 (701.9)		416.39 (1319.8)	
$\begin{array}{rrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrrr$	01 641.44 < 0.001 378.31 < 0 (1620.5) (1299.6)	<0.001 378.31 <((1299.6)	378.31 <((1299.6)	00.0	1 252.56 0. (886.1)	735 132.41 (218.2)	0.036	433.92 (667.6)	< 0.001	515.37 (495.9)	< 0.001	191.92 (1122.7)	< 0.00
2093.33 430.38 263.88 (2977.5) (1320.2) (925.1)	430.38 263.88 (1320.2) (925.1)	263.88 (925.1)	263.88 (925.1)		258.97 (901.5)	118.81 (184.6)		348.88 (544.9)		560.70 (538.4)		111.72 (829.0)	
2008.57 < 0.001 353.79 < 0.001 259.82 < (3122.7) (1180.7) (1019.9)	J1 353.79 <0.001 259.82 < (1180.7) (1019.9)	<0.001 259.82 < (1019.9)	259.82 < (1019.9)	0.00	1 271.03 0. (918.2)	005 107.00 (185.0)	< 0.001	403.45 (623.1)	0.039	470.91 (425.9)	< 0.001	142.56 (901.1)	< 0.00
2961.81 914.80 439.38 (3745.2) (1911.1) (1274.4)	914.80 439.38 (1911.1) (1274.4)	439.38 (1274.4)	439.38 (1274.4)		221.61 (837.0)	166.01 (226.1)		359.91 (553.6)		703.72 (645.0)		156.39 (1110.9)	
2295.20 522.49 313.81 (3350.6) (1462.5) (1105.6)	522.49 313.81 (1462.5) (1105.6)	313.81 (1105.6)	313.81 (1105.6)		256.17 (894.8)	124.74 (200.1)		390.35 (603.4)		540.92 (520.7)		146.72 (968.9)	

Table 4 Healthcare costs (ε) by frailty status, sex, and age 2018–2019

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Table 5 Linear regression analysis (LRA) of the incremental cost attributed to frailty adjusted by age and sex

	Model 1: Frailty in 4 ca	ategories	Model 2: Frailty	in 2 categories
	Bivariate LRA (unad- justed)	Multivariate LRA (adjusted)	Bivariate LRA (unadjusted)	Multivariate LRA (adjusted)
Frailty	1400.097**	1392.214**	2499.181**	2342.583**
Age		184.5115**		546.1348**
Female		(-) 643.1798*		(-) 606.113**
Constant	1426.738**	1738.646**	1986.932**	2183.636**
R2	10.17%	11.09%	6.02%	7.23%

Beta coefficients expressed in €

$$*P < .05, **P < .001$$

than frailty treatments. Second, public health systems need to plan for and accommodate a growing demand for health resources by the elderly, as the prevalence of frailty in recent decades has been growing (Hoogendijk et al. 2021), and an important increase in the population aged > 65 years is forecast for the coming decades. In fact, even if frailty and pre-frailty prevalence could be reduced through preventive actions, the absolute number of frail and pre-frail subjects will increase due to population ageing. Healthcare institutions need to anticipate the increase in the frail population in order to coordinate health and social interventions that guarantee adequate care for the elderly. Finally, factors that affect access to health resources need to be considered a priority area for research, especially in the case of women. It has been suggested that widowhood could explain the gender gap in health resource use (Dios-Guerra et al. 2021; Mondal and Dubey 2020), as widowed women are more likely to experience economic deprivation. However, when access to public health is free, as in Spain, economic hardship cannot be the only explanation. Further research is needed to better understand healthcare use predictors for women, as the results should serve to design specific gender policies aimed at reversing inequality in access to health resources.

Main study limitations include: (a) the tariffs applied to translate health resource use into monetary units (\mathbf{f}) are specific for our context, so results cannot be extrapolated to other settings or healthcare systems, (b) medication costs and social costs of institutionalization or care for dependency were not considered, c) the study considered only inhabitants ascribed to 3 primary care centres in Catalonia, and although they represent heterogeneous population segments (urban, suburban, and rural), the results cannot be extrapolated to the whole population, and d) although the e-SIF contemplates a large number of comorbidities, clinical conditions and polypharmacy and that the effect of frailty on healthcare costs has been adjusted for age and sex, we cannot rule out some residual confounding by other variables not included in the model and not



part of the e-SIF. It is important to distinguish frailty from multi-comorbidity. While frailty is a geriatric syndrome characterized by greater vulnerability to suffering from illness and other adverse health outcomes, multi-comorbidity refers to the clinical condition of those people who accumulate two or more chronic diseases. Both concepts are closely related but must be distinguished because most but not all frail are comorbid and not all comorbid are frail. Despite this, with the definition of frailty according to the model of accumulation of deficits or clinical conditions, it is hard to differentiate which part of the increase in costs is due to frailty and which to comorbidity with demonstrated increased healthcare costs (Wang et al. 2018; Vela et al. 2019). This would require another operational definition of frailty that did not include comorbidities.

To sum up, in the population aged > 65, independently of age, as frailty increases, health resource use increases, to the point where the healthcare cost for frail subjects is more than double (2.25 times greater) that of non-frail subjects, representing an additional annual healthcare spend of nearly €1170 per frail person. For pre-frail subjects, the healthcare cost is also double that of robust subjects. Given that pre-frailty is much more prevalent than frailty in the population aged > 65, and that the effectiveness of preventive actions is high, interventions in the pre-frail group rather than in the frail group are likely to have a greater economic impact. Our results, which underline the economic implications of frailty in later life, suggest that postponing or reducing frailty will reduce healthcare costs and contribute to making the healthcare system more efficient and sustainable.

Author contributions AL: Design, data gathering, data interpretation, and reviewing manuscript. JS: Data analysis, design, data interpretation, and reviewing manuscript. MSP: Study conception and design, data interpretation, and writing first draft. EB: Study conception and reviewing manuscript. MC: Study conception and reviewing manuscript

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Declarations

Ethics The study protocol was approved by the local ethics committee (reference: CEIm CSdM 06/20). This project is part of the doctoral thesis of Àngel Lavado, Department of Medicine and Biomedical Sciences, University of Vic (UVIC).

Competing interests The authors declare no competing interests.

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