SYSTEMATIC REVIEW



Do Costs in the Education Sector Matter? A Systematic Literature Review of the Economic Impact of Psychosocial Problems on the Education Sector

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Abstract

Background Psychosocial (e.g., anxiety or behavior) problems lead to costs not only in the healthcare sector but also in education and other sectors. As psychosocial problems develop during the critical period of establishing educational trajectories, education costs are particularly relevant in the context of psychosocial problems among children and adolescents. **Objectives** This study aimed to gain insights into the methods used for the inclusion of education costs in health economics studies and into the proportion of the education costs in relation to the total costs associated with a condition or an intervention.

Methods We systematically searched the PubMed, Embase, SSCI, CINAHL, PsycINFO, ERIC, and Econlit databases in August 2019 for economic evaluations of mental health, psychosocial and educational interventions, and cost-of-illness studies of mental, behavioral, and neurodevelopmental disorders conducted from a societal perspective in populations of children and adolescents. An additional search was conducted in February 2021 to update the review.

Results In total, 49 articles were included in the analysis. The most common cost items were special education, school absenteeism, and various educational professionals (educational psychologist). A variety of methods were employed for the identification, measurement, and/or valuation of education costs. The proportion of education costs to the total costs of condition/intervention ranged from 0 to 67%, with the mean being 18.5%.

Discussion Since education costs can constitute a significant proportion of the total costs of an intervention or condition, including them in health economics studies might be important in informing optimal resource allocation decisions. Although various methods are available for including education costs in health economics studies, further research is needed to develop evidence-based methods for producing comparable estimates.

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1 Introduction

Individuals affected by psychosocial problems not only have an increased need for healthcare but also their ability to participate in education and work or enjoy leisure time may be diminished. Hence, the economic impact of psychosocial problems is cross-sectoral and is not limited to the healthcare sector [1]. In fact, a large proportion of the costs associated with psychosocial problems occurs in sectors other than healthcare, including education, employment and productivity, informal care, and criminal justice [1, 2]. In the absence of a commonly accepted definition, for this study we defined psychosocial problems as a range of psychological problems (e.g., learning difficulties, anxiety, behavioral issues) and social problems (e.g., educational or family difficulties) that affect one's "functioning in daily life, his or her environment

Key Points for Decision Makers

Psychosocial problems among children and adolescents often lead to costs in the education sector. However, these costs are not often included in health economics studies.

While a variety of methods for identification, measurement, and valuation of education costs in health economics are available, systematic guidance on which methods are the most optimal is lacking. This hampers the comparability and transferability of study results.

The results of this study suggest that the proportion of the education costs in relation to the total costs associated with psychosocial problems can be substantial. Therefore, considering these costs for inclusion in health economics studies can be important for informing optimal resource allocation decisions.

and/or life events" [3]. As psychosocial problems often begin to develop in childhood or adolescence, their onset might occur during the period when individuals establish their educational trajectories [4]. Therefore, the economic impact of psychosocial problems on the education sector is likely to be particularly evident in the context of common conditions among children and adolescents (e.g., autism and attention-deficit/hyperactivity disorder). Research shows that supporting individuals with psychosocial problems can incur far more costs than attributable to their peers without these problems [5, 6]. Psychosocial problems among children and adolescents can lead to diminished school productivity and school performance, increased need for additional support at school, early dropout, and potentially reduced educational attainment, all of which are associated with substantial overall societal losses and excessive costs for the education sector in particular [2, 5, 7, 8]. Several health economic studies in the psychosocial domain have also demonstrated that education costs can constitute a large proportion of the total costs and even be the most expensive cost category [9, 10]. Therefore, including education costs in health economics research studies could be crucial to ensuring optimal resource allocation decision making [11].

Despite recent methodological developments in identifying, measuring, and valuing education costs [12–16], their inclusion in costing research remains limited [17]. This could be attributed to several reasons. First, a narrow perspective is still predominant in the majority of current pharmacoeconomic guidelines, many of which neglect costs other than healthcare and productivity costs [18]. Second, explicit methodological guidance on how to collect,

measure, and value education costs in health economics studies is limited. The current methods for the identification, measurement, and valuation of the education costs in health economics focus only on a limited number of costs and do not allow for producing valid and internationally comparable estimates. Third, the evidence regarding the impact of education costs on the results of health economics studies is lacking. Although several studies have demonstrated that the proportion of education costs to total costs can be significant [9, 10], a systematic synthesis of the existing evidence could provide a sound rationale for including education costs in health economics research studies in the psychosocial domain.

Given these research gaps, a systematic review of health economics studies, i.e., economic evaluations and cost-ofillness studies, in the psychosocial domain was conducted to fulfill the aims of this research. As discussed in more detail in the methods section, potentially relevant studies included economic evaluations of psychosocial interventions and cost-of-illness studies of mental health, behavioral, and neurodevelopmental disorders. First, this study aimed to gain insight into whether studies in the psychosocial domain included education costs, and, if so, what methods they used to identify, measure, and value education costs. This would provide an overview of the available methods for including education costs in health economics studies and highlight current knowledge gaps, information that can direct further research in this field. Second, this study aimed to estimate the proportion of the total costs that education costs account for, to provide justification for including education costs in health economics studies.

2 Methods

This study adopted a systematic review methodology standardized in health economics, based on the methods described by van Mastrigt et al. [19]. Reporting of the results was based on the Preferred Reporting Items for Systematic Reviews and Meta-Analyses (PRISMA) statement [20].

2.1 Data Collection

To identify health economics research studies that included costs in the education sector, seven electronic databases were searched in August 2019: PubMed, Embase (Ovid), SSCI (Web of Science), CINAHL (EBSCO), PsycINFO (EBSCO), ERIC (EBSCO), and Econlit (EBSCO). The selection of databases and the search string were developed and consolidated by the research team in collaboration with an information specialist. An example of the search string in PubMed is available in the electronic supplementary material (ESM)-1. An additional search using the same approach

was carried out in February 2021 and covered the period between August 2019 and February 2021.

Inclusion and exclusion criteria for the identified studies were based on the PICOS framework [21]. They included studies with a population of children and adolescents aged 0–25 years (P), investigating psychosocial and educational interventions (I), regardless of the comparator (C) or the outcomes (O), relating to societal costs, and designed either as a full economic evaluation or cost-of-illness study (S). Psychosocial interventions were defined as "interpersonal or informational activities, techniques, or strategies that target biological, behavioral, cognitive, emotional, interpersonal, social, or environmental factors with the aim of improving health functioning and well-being" [22]. Both economic evaluations and cost-of-illness studies were considered for inclusion only if costs in the education sector were included as intersectoral costs associated with a condition or an intervention. Studies that included costs in the education sector as part of the intervention costs (e.g., training of professionals, materials) were considered beyond the scope of the current review and excluded, as there is research that provides detailed methodological guidance on how to include intervention costs in economic evaluations [23]. The relevance of cost-of-illness studies was determined based on the International Classification of Diseases, Eleventh Revision; the relevant conditions were mental health and behavioral and neurodevelopmental disorders [24]. Studies were excluded when the abstract and/or the full text was not available in the English language or could not be accessed.

2.2 Identification and Screening of Relevant Studies

All hits were imported into Endnote X8.2 and de-duplicated using the method determined by Bramer et al. [25]. One reviewer (IP) performed title and abstract screening. The second reviewer (LJ) screened 10% of randomly assigned titles and abstracts. A similar procedure was employed for the full-text screening. Differences in inclusion were resolved by discussion between the two reviewers. The ultimate inclusion of studies based on full-text screening was determined in the discussion between the two reviewers.

2.3 Data Extraction and Analysis

The number of studies that were excluded during full-text screening because they did not include education costs and the number of studies that complied with the inclusion criteria were used to calculate the proportion of the studies that included education costs. Data extraction for the studies that complied with the inclusion criteria was conducted by multiple reviewers independently. One reviewer extracted data from all studies (IP); two reviewers (RD, LS) extracted data

from 50% of the included studies each. The data on the general characteristics of the selected articles and the methods used to identify, measure, and value education costs were extracted using a predefined template adapted from Wijnen et al. [26], which was piloted on 10% of the included studies by two reviewers (IP and LJ) (ESM 2).

The reported unit costs were recalculated to €, year 2021 values, using an online inflation tool [27] and a currency converter [28] and presented in ranges per reported measurement unit (e.g., per day, per year). When the original year for reported unit costs was not provided, the year of the article's publication was used for the recalculation. For studies that included costs in the education sector and reported the breakdown of total costs and/or incremental cost-effectiveness ratio calculation, the percentage of total costs that was accounted for by costs in the education sector was determined. When multiple groups (i.e., treatment arms) were compared in an article, the percentage of education costs was calculated separately for each group. The overall proportion of the education costs was calculated as the average of every estimate. In addition, this proportion was also calculated by averaging the mean estimates per article to avoid bias. The percentages of education costs for each condition were summarized and presented separately. When articles reported the inclusion of costs in the education sector but did not provide the breakdown of total costs, the authors of these articles were contacted for further information.

3 Results

The database search conducted in August 2019 resulted in 10,236 hits. After de-duplication, the titles and abstracts of 6248 articles were screened, and 5937 of them were excluded. The full texts of 311 records were assessed for eligibility, resulting in 270 records being excluded. The additional search in February 2021 resulted in 1705 hits. After de-duplication, the titles and abstracts of 1048 articles were screened and 995 of them were excluded. The full texts of 53 records were assessed for eligibility, resulting in 45 records being excluded. In total, 41 records identified in the search in August 2019 and eight records identified in the search in February 2021 fulfilled the inclusion criteria and were included in the analysis. The process of the literature search and selection is shown in the PRISMA flowchart (Fig. 1).

3.1 General Study Characteristics

In total, 49 studies fulfilled the inclusion criteria and were included for data extraction and data analysis [9, 10, 29–75]. The majority of the studies (n=16 [33%]) were conducted in the Netherlands, the USA (n=8 [16%]), and Canada (n=7 [14%]), followed by the UK (n=5 [10%]), Sweden (n=5 [10%])

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[10%]), Germany (n=2 [4%]), Australia (n=1 [2%]), Spain (n=1 [2%]), and Ireland (n=1 [2%]). Furthermore, two studies focused on multiple countries [36, 45], and one study did not focus on any particular country [55]. Concerning the study design, over one-half of the studies were cost-of-illness studies (n=26); the remaining studies were either trialbased (n=12) or model-based (n=8) economic evaluations or a combination of both (n=1) [51]. One study described an economic evaluation study using a quasi-experimental design [74]. One study combined a cost-of-illness study with a model-based economic evaluation [32]. The majority of the studies focused on mental and neurodevelopmental disorders among children and adolescents, including autism spectrum disorder (n=10), attention-deficit/hyperactivity disorder (n=8), and anxiety disorders (n=6).

3.2 Methods for Including Education Costs

3.2.1 Identification

In total, 92 education cost items were extracted from the 49 studies and clustered based on similar descriptions (ESM 3). The most commonly identified education cost items were special education (n=22), school absenteeism (n=17), different types of professionals in the education sector (n=17), and additional educational support services such as tutoring and homework help (n=8). Two studies reported using the classification scheme by Drost et al. [14] to identify relevant education costs [41, 73]. In five studies, relevant cost categories were identified based on the literature search [9, 45, 52, 55, 64]. In one study, cost selection was based on data included in administrative records [51]. In addition,

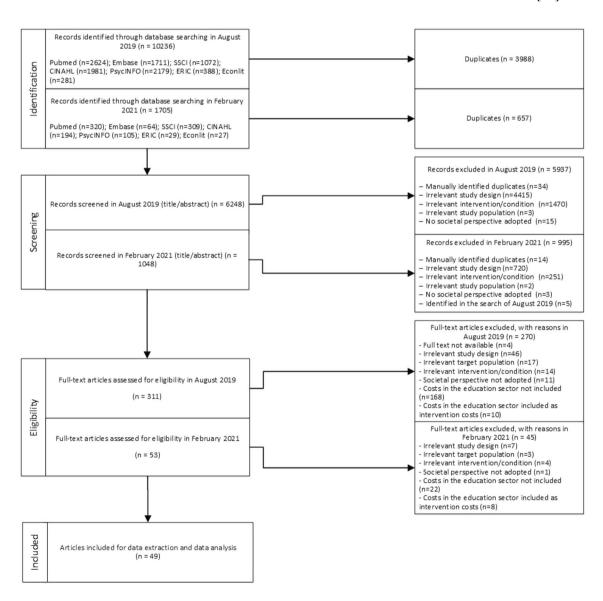


Fig. 1 PRISMA flowchart of the literature search and selection

the authors of five studies justified their selection of cost categories as including all potentially relevant costs based on the definition of a societal perspective [30, 33, 38, 47, 71] and education costs in particular as "typical components of direct nonmedical costs" [43], "important cost for many children with autism" [47], and "important resource units" [72]. The majority of the studies (70%) did not report any specific methods used for identifying the education cost items.

3.2.2 Measurement

For measuring education costs, 27 studies used self-reported data, 13 studies derived data from the literature (i.e., other studies), six studies used other secondary sources (e.g., national-level statistics data, government reports, administrative records), two studies used a combination of primary and secondary data [45, 74], and one study used literature combined with expert opinion [64]. Figure 2 illustrates the frequency of the use of the measurement methods per cost item. For example, special education was measured most often using literature (n=8) or self-reported data (n=8), followed by a combination of methods (n=4) and other secondary sources (n=2). The figure shows that most education cost items (n=65) were measured using self-reported data. It is important to note that, in Figs. 2 and 3, the extracted cost items are presented based on the clustering as described above.

The majority of studies collected self-reported data from parents or other primary caregivers (n=21); fewer studies collected self-reported data from children or adolescents alone or in addition to caregivers (n=5), study investigators (n=1), or government officials (n=1). The most common

methods for collecting self-reported data were questionnaires (n=21), followed by cost diaries (n=5), and case report forms (n=1). The resource-use measurement questionnaires that were used included the (modified) Treatment Inventory of Costs in Patients with psychiatric disorders (TiC-P) (n=6), the modified Client Service Receipt Inventory (n=1), the Child and Adolescent Service Use Schedule (n=2), the Carer Service Use Schedule (n=1), the Expenditures for Health and Social Service Utilization Questionnaire (n=1), the Child and Adolescent Services Assessment (n=1), the Studying the Costs of Parental Expenditures instrument (n=1), or other study-specific resource-use measurement instruments (n=5). Nine articles did not report what specific resource-use measurement instruments were used to collect self-reported data.

3.2.3 Valuation

The unit costs for the extracted education cost items (n=92) were derived from various secondary data sources (n=65 [70%]), calculated by the authors using secondary data (n=12 [13%]), taken at face value (e.g., out-of-pocket expenses) (n=5 [5%]), or calculated based on the market price of a given service (n=1 [1%]). Nine items (10%) were not valued or were included as either intangible costs (i.e., they were measured but not valued) or as the impact on a caregivers' costs (e.g., lost productivity, time, or money). The secondary sources of unit costs included official public sources such as national-level public data (e.g., government reports) (n=34), costing guidelines (n=12), literature (n=11), or a combination of literature and public sources (n=1). For seven items, the sources of unit costs were not

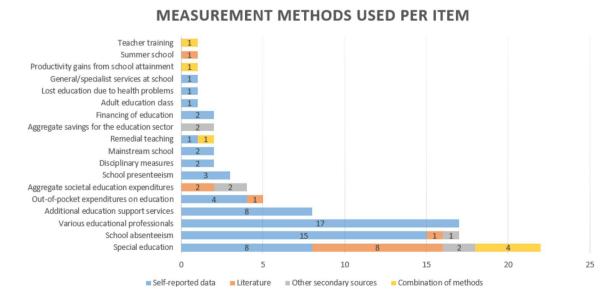


Fig. 2 Methods used for the measurement of the education costs

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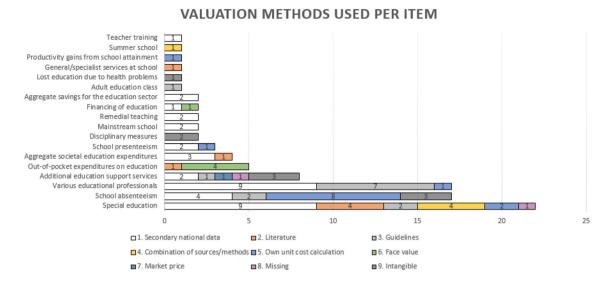


Fig. 3 Methods used for the valuation of the education costs

reported. For the 30 extracted items, the unit costs were not reported.

Figure 3 illustrates the frequency of use of different methods for the valuation of education cost items. For example, the unit cost of school absenteeism was most frequently developed by the authors (n=8) or extracted from secondary national sources (n=4). In three studies, school absenteeism was included as an intangible cost, and two studies used costing guidelines. ESM 3 provides a detailed overview of the measurement and valuation methods applied to measure and value the extracted items. The reported unit costs of the education cost items are presented in Table 1 in \in , year 2021 values, per measurement unit. The items for which the unit of measurement was not reported are presented in separate rows.

3.3 Contribution of the Education Costs to the Total Costs

Of the 49 included studies, 31 contained sufficient detailed information to calculate the proportion of the education costs. Contact with the authors did not allow us to collect any additional information either because of nonresponse or lack of time to provide further information. Because some studies included multiple groups or treatment arms, the number of estimates (n=72) was higher than the number of studies (n=31). The average proportion of the education costs based on the average of every estimate was 18.48% (n=72), ranging from 0 to 78.5%. A slightly higher proportion of 20.37% was estimated based on the average of the means per study (n=31). Figure 4 illustrates the percentage of the education costs to total costs. The majority of the estimates (64% [n=46]) lay below the mean value of

18.48%. Approximately one-quarter of the estimates (22% [n=16]) were within the range between the mean and 40%. Only 13% (n=10) of the estimates were above 40%, in the range of 44.3–78.5%. The highest estimates (above 50% of the total costs) were reported in six studies; one was an economic evaluation of an exposure-based cognitive behavioral therapy for adolescents diagnosed with irritable bowel syndrome [63]; five were cost-of-illness studies of autism spectrum disorder, intellectual disability, attention-deficit/hyperactivity disorder, and mental problems in general in a population of children and adolescents [9, 10, 36, 44, 52]. A summary of the studies is provided in ESM 4.

The largest number of estimates was provided for the studies that investigated autism spectrum disorder (n=18), anxiety disorders (n=9), and attention-deficit/hyperactivity disorder/attention-deficit disorder (n=8). The highest proportion of education costs was observed for intellectual disability disorder (67%), but this was based on a single study [44]. Studies that focused on autism spectrum disorder and attention-deficit/hyperactivity disorder/attention-deficit disorder accounted for the second and third highest proportion of education costs: 30 and 24%, respectively.

4 Discussion

Psychosocial problems have a far-reaching impact on all societal sectors, including the education sector [2]. The economic impact of psychosocial problems on the education sector is especially relevant for children and adolescents [5]. Nevertheless, little is known about including costs from the education sector in health economics studies in the psychosocial domain. The aim of this study was to

Table 1 Unit costs of the education cost items

Item	Measurement unit	Range (€, year 2021 values)	Sources
Special education	Per day	15.4–15.6	[64, 70]
	Per month	449.8	[69]
	Per year	588.1-56,534.5	[10, 42, 45, 47, 56, 58, 59, 71]
	Average lifetime cost	7949.1–13,852.8	[32, 57]
	Not reported	677-1771.32	[62]
School absenteeism	Per hour	5.3-11.4	[33, 34, 65, 66, 71]
	Per day	28.6–68	[38, 48, 53, 54, 63]
School presenteeism	Per day	61.6–68	[48, 53, 63]
Remedial teaching	Per visit	63.6	[64]
	Per hour	63.1	[69]
Aggregate societal expenditures for education	Per year	5599.3-6981.7	[9, 55]
Study/homework help	Per hour	44.1	[48]
Tutoring help	Per hour	48.7	[53]
Educational psychologist	Per hour	48.5	[62]
	Not reported	51	[38]
Attendance officer	Per hour	47	[41, 73]
Teacher training	Per visit	83.4	[64]
General/specialist services at school	Not reported	25.3	[40]
Education welfare officer	Not reported	27.6	[38]
Family liaison officer (school)	Per hour of client work	67.5	[38]
School counselor	Per hour	14.9	[30]
Special needs assistant	Per hour	18.6	[62]
Teacher	Not reported	48.2	[38]
Parental out-of-pocket expenses related to child's education	Annual per patient and total costs	64.3	[9]
Financing of education	Per year	13,846.7 or 27,693.4 ^a	[44]
	Not reported	193-1094	[62]
Aggregate savings for the education sector	Per year per child	8185.40	[61]
Productivity gains from school attainment	Per high school diploma	171,133-23,7784.9	[74]

^aDepending on disability level

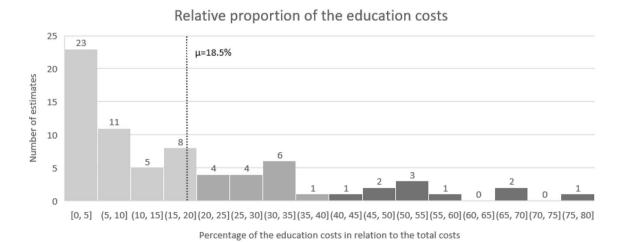


Fig. 4 Relative proportion of the education costs in relation to the total costs (n=72)

investigate whether health economics studies in the psychosocial domain that focused on child and adolescent populations included costs from the education sector, and, for those studies that did, what methods the authors used to identify, measure, and value these costs. In addition, for the studies that included education costs, this study aimed to estimate the proportion of education costs to total costs.

The findings of this study revealed that only approximately 20% of the health economics studies relating to the psychosocial domain included education costs. Regarding the country of origin of the included studies, the consideration of education costs is explicitly recommended only in the Dutch, Canadian, and Irish pharmacoeconomic guidelines [76–78]. However, in the absence of evidence-based guidelines in other countries regarding including education costs in health economics studies, it is difficult to assess whether the education costs should have been included in each particular study. For example, the guidelines of the National Institute of Health and Care Excellence in the UK suggest considering broader costs if these are substantially influenced by an intervention but do not provide any further guidance in terms of the types of costs to be included and how to determine their relevance [79]. This means that the decision whether to include education costs oftentimes depends on the researchers, who might not be aware of the relevance of the education costs and might be constrained by a lack of resources, the requirements of the national pharmacoeconomic guidelines, and other factors. In addition, the decision to include education costs might also lead to the need for additional resources (e.g., extended questionnaires, more time for data analysis), which are often scarce.

The education cost items identified in this review comprise services, professionals, lost productivity (i.e., absenteeism and presenteeism), and the financial expenses on education. The list also includes disciplinary measures (i.e., detention, expulsion, etc.), which were relevant in the context of attention-deficit/hyperactivity disorder, although these were not valued. In comparison with the existing classifications [14, 16], this study identified more services and educational professionals. However, intangible consequences, such as reduced educational attainment or problems with school entry, were scarcely captured in the reviewed studies. It is important to note that the costs associated with reduced school attainment become more apparent in the longer term, which makes it more challenging to capture these costs in studies with shorter time horizons of 1 or 2 years. In addition, the most frequently included education cost items, "special education," "absenteeism from school," and "additional educational support (e.g., tutoring, homework help)," correspond with the findings of the recent review of health-related resource-use measurement instruments by Mayer et al. [13]. However, less tangible resource-use items such as "school functioning" and "social functioning" were also not included in the reviewed studies. This might be attributed to the limited time horizon of the studies as well as the difficulty of valuing these costs. Furthermore, it can be argued that these costs can also be captured by quality-of-life measurement instruments. This highlights the relevance of the issue of double counting, which researchers need to be aware of.

A variety of methods were employed for measuring and valuating the education costs. Self-reported data were used more frequently than secondary data sources. Furthermore, the studies that were based on self-reported data included more cost items than the studies that relied on secondary sources, which often provide pooled estimates. Resourceuse measurement questionnaires were preferred over other self-reported data collection methods, with TiC-P being the most commonly used. There was considerable variation between the estimates for comparable items, which could be attributed to the selection of the measurement and valuation methods, among other factors. In addition, the content of the items was not always clearly based on the name and/or the semantic description of the item, which further limited comparability. For example, special education was the most commonly included education cost in the reviewed studies. However, it was not always clear how the authors defined special education and, based on the definition, what type of service was measured and valued. Above all, the findings suggest that the variability in the methodologies used to include education costs and the general lack of transparent reporting limits meaningful comparison between the studies. This also indicates the need for the development of evidence-based harmonized methods and instruments.

The proportion of education costs in the reviewed studies varied from 0 to 78.5%. The highest proportion (above 50%) of the total costs) was observed in studies of autism spectrum disorder, intellectual disability, attention-deficit/hyperactivity disorder, and mental problems in general in populations of children and adolescents. It is important to note that the proportion of the education costs in the reviewed studies might have been influenced by the choice of study design as well as by the number of cost categories and the number of the education cost items included in each particular study. Nevertheless, this finding suggests that education costs can constitute a significant proportion of the total costs and thus are likely to influence the results of the study. This also provides a rationale for considering including education costs in health economics studies in the psychosocial domain to ensure optimal resource allocation in society.

4.1 Methodological Reflections

To the best of our knowledge, this is the first study to systematically review health economics literature in relation to the inclusion of education costs. Broad inclusion criteria

were employed to incorporate studies with various designs. Furthermore, a detailed overview of possibly relevant cost items and currently available methods for including education costs in health economics studies was presented. Nevertheless, the study is also subject to several limitations. First, the context of this study was limited to the psychosocial domain, whereas education costs can also be relevant for other disease areas (e.g., infectious diseases) [17]. Using the methods of the current study to investigate economic evaluations and cost-of-illness studies in other contexts could provide a more complete overview of the available methods for including education costs. Second, the inclusion criteria for this study were fairly broad, which allowed for collecting more data but did not allow for making meaningful comparisons between studies that included education costs and studies that did not, because of heterogeneity. Third, the involvement of a second reviewer in the screening process was limited to a random sample of 10% of the studies at each stage. Fourth, the findings of the current study depended on the quality of reporting in the included articles, particularly regarding transparency and the level of detail when reporting the methods that were used for the identification, measurement (e.g., measurement units, resource-use measurement instrument used), and valuation (e.g., unit costs and their sources) of the education costs. Furthermore, the lack of detail in several studies did not allow for calculation of the proportion of the education costs. Although several attempts were made to contact the authors of the studies, we were unable to gather additional information, either because of lack of time or nonresponse.

It is also important to note that the definition of the education sector and what falls under it might not always be clear. The reviewed studies included several cost items that might not necessarily fall within the education sector. For example, government subsidy on education might fall within the government sector, as it does in the Canadian costing guidelines [77]. Another example is out-of-pocket expenses for education, which might in fact fall within the category of patient and family costs, as these costs are incurred by the household. In addition, training of professionals (e.g., nurses) who will be delivering an intervention might also be an example of an education cost. In this study, we included training of professionals as part of intervention costs, although it was considered an education cost if the intervention was set in the education sector but not if the intervention was set in another sector (e.g., healthcare sector). While this could be considered a limitation, the literature provides detailed methodological guidance on how to include intervention costs in economic evaluations [23]. Therefore, further investigation of these studies was beyond the scope of the current article.

4.2 Implications for Further Research

The findings of this study demonstrate that the incorporation of education costs in health economic studies can be hindered because of the lack of methodological guidance and difficulties collecting reliable comparable data to estimate these costs. These challenges dictate the need for further research in this direction. First, the relevance of including education costs depends on various factors such as target population, condition and/or intervention of interest, and national setting, among others. Further research could focus on investigating the relevance of specific education cost items in relation to these factors, for example, which costs are most relevant for the child population with attentiondeficit/hyperactivity disorder. Second, the use of standardized terminology might help facilitate the comprehensibility and comparability of the cost items. One example of a classification system that can facilitate the comparability of the services is the standard taxonomy for description, mapping, and comparison of services for long-term care (Description and Evaluation of Services and Directories in Europe for Long-Term Care [DESDE-LTC]) [80]. It has been widely used in health services research to enable comparison of services across settings [81]. Application of this system to other sectors, including the education sector, might help facilitate the comparability of the services included in future health economics studies. Third, reduced educational attainment because of psychosocial problems in childhood and adolescence can influence one's labor market outcomes [5], which might be especially notable for individuals whose educational needs have not been met. Accounting for this relationship would be particularly relevant for studies that adopt a long-term timeframe and would require further research to develop appropriate methods for capturing this effect in health economic evaluations and cost-of-illness studies. It is also important to consider the potential issue of double counting that might arise because costs associated with educational attainment and consequences on the labor market would be interlinked. Fourth, future research is needed to investigate the appropriate methods for the valuation of school productivity, since school productivity is conceptually different from work-related productivity.

5 Conclusion

Education costs can constitute a large proportion of the total costs in health economics studies set in the psychosocial domain, especially in populations of children and adolescents. Therefore, inclusion of education costs, if those are substantially affected given the study context, could be crucial for informing optimal resource-allocation decisions. The findings of this study demonstrate that, although methods

for the identification, measurement, and valuation of the education costs are available, the lack of methodological guidance regarding the proper use of the methods leads to considerable variation and limits the comparability of the studies. This indicates the need for further research in this direction, especially with respect to the development of evidence-based methodological recommendations for the inclusion of the education costs in health economics studies. By demonstrating the broader impact of psychosocial conditions and interventions to treat them on the education sector, health economics research can play a crucial role in optimizing the use of limited societal resources. Further research in this direction also has the potential to alleviate the urgent problem of underfunding of the mental health domain by attracting additional (cross-sectoral) resources.

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Declarations

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Availability of data and material All data collected and analyzed during this study are included in this published article and its supplementary information files.

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