Society for Pediatric Research

# SPECIAL ARTICLE <br> Gender disparities in pediatric research: a descriptive bibliometric study on scientific authorships 

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#### Abstract

BACKGROUND: The proportion of women in medicine, especially in pediatrics, is noticeably increasing. Yet, leadership positions are predominantly occupied by men. METHODS: Academic authorships of 156,642 pediatric original research articles were analyzed with regard to gender disparities. The evaluation included the proportion of female authorships (FAP), distributions over first-, co- and last-authorships, genderrelated citation rates, a productivity analysis and investigations on journals, countries and pediatric sub-disciplines. RESULTS: In all, $46.6 \%$ of all authorships in pediatric research were held by female authors. Women held relatively more firstauthorships (FAP $=52 \%)$ and had higher odds for first- $(O R=1.3)$ and co- $(O R=1.11)$ authorships, compared to men. The Prestige Index of -0.13 indicated an underrepresentation of female authors at prestigious first- and last-authorships. Citation rates were not affected by the gender of the key authors. At the country-level pronounced gender-related differences were detected. The time trend showed increasing female prospects forecasting a female-dominated Prestige Index of 0.05 in 2023. CONCLUSION: The integration of women in pediatric research has advanced. Opportunities for female authors differ at the country-level, but overall women are lacking in leadership positions. Improving career opportunities for women in pediatric research can be expected in the coming years.


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## IMPACT:

- There is a measurable progress in the integration of female scientists.
- Gender-neutrality is partially achieved in pediatric research with yet a female underrepresentation in leading positions.
- Our descriptive study presents gender-related dynamics in pediatric research that forecast improving career opportunities for female scientists.


## INTRODUCTION

Pediatrics is dominated by women. ${ }^{1}$ The feminization of medicine is widely apparent, but particularly noticeable in pediatrics. Historically, the sociological assignment of childcare to the role of women made it easier for female doctors to enter pediatrics. ${ }^{2}$ Over the past decades, the proportion of women in pediatrics has steadily increased. ${ }^{2}$ Today, $>70 \%$ of the pediatric residents in the US are female. ${ }^{1}$ However, gender inequity is evident when considering leadership positions, such as pediatric department chairs, with a female proportion of $26.3 \%$ in $2020 .^{3}$

In this study, we examine the integration of female scientists in pediatric research based on scientific authorships. We anticipate that early-career researchers primarily publish as first- or coauthors in original articles, while senior researchers preferably publish as last-authors. ${ }^{4-6}$ First- and last-authorships are associated with a certain prestige and are considered a type of currency in academic medicine. ${ }^{4,7}$

Gender disparities have recently drawn a lot of interest and were evaluated for several medical subjects. ${ }^{5-80}$ Overall, female
authors are numerically under-represented in academic medicine and reach lower citation rates than their male colleagues. ${ }^{12,21,22}$ Previous research on selected pediatric journals has shown an increasing proportion of female authors. ${ }^{5,20}$ Fishman et al. ${ }^{5}$ examined three pediatric high-impact journals. They detected an overrepresentation of women at first-authorships with $57.7 \%$ and an underrepresentation of women at last-authorships with $38.1 \%$ in 2016, in the selected journals. ${ }^{5}$ Regarding perspective-type articles in four pediatric high-impact journals, Silver et al. ${ }^{23}$ documented a female underrepresentation at first-, co- and lastauthorships. ${ }^{23}$ The analysis of three Latin American pediatric Journals by Otero et al. ${ }^{20}$ on the other hand revealed relatively high proportions of female authors. ${ }^{20}$ In their data set $59.9 \%$ of all authors, $54.4 \%$ of first-authors, and $48 \%$ of last-authors were women in 2015. ${ }^{20}$

To obtain representative results for the entire field of pediatric science, we analyzed original research data from a total of 400 journals with >690,000 authorships. We evaluated the temporal development and gender-specific citation numbers, and compared

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gender distributions of countries, journals and pediatric subdisciplines. Finally, we provide a forecast for the near future.

## MATERIALS AND METHODS

## Data acquisition and integration

Pediatric English-language original research articles published between January 1, 2008 and December 31, 2018 form the basis of this study. The data were acquired from the category 'Pediatrics' of the Web of Science Core Collection. The integration and bibliometric analysis was performed by Gendermetrics.Net, ${ }^{24}$ a SQL server-based software. ${ }^{24}$ The process included the unification of authors by grouping them by their first and last name. In total, 156,642 articles published in 400 journals written by 363,518 authors from 182 countries were acquired (bibliometric overview in Supp. Fig. 1). ${ }^{24}$

## Gender determination

The gender determination was algorithmically conducted through Gendermetrics.Net by evaluation of the authors' first name(s). ${ }^{24}$ We found 146,453 (=40.3\%) female authors and 129,729 ( $=35.7 \%$ ) male authors. 16,673 (=4.6\%) authors had unisex first names and 70,663 (=19.4\%) first names could not be identified. Authors with unisex or non-identified forenames and their corresponding authorships (in total 162,400 authorships) were excluded from the gender analysis. The remaining 690,436 male and female authorships formed the data basis of the gender analysis.

For sub-analyzes, data were grouped by different criteria (publication year, country of authorship, journal, number of authors per article, subject areas). In order to ensure the statistical validity, only groups with at least 750 male/female authorships and a gender detection output of a least $60 \%$ male and female authorships were included. ${ }^{13}$ The application of the stated criteria led to an exclusion of 287 journals from the journal-specific analysis because of too low numbers of detected female/male authorships. From the country-specific analysis China and South Korea were excluded owing to too high rates of unisex names.

Furthermore, subject areas were defined by tags of Web of Science and formed the basis for the corresponding sub-analysis.

## Proportion of female authorships and female authorship odds ratio

The subjects of the analysis were first-, co- and last-authorships. ${ }^{11}$ Single authorships were rated as first-authorships, authorships of articles with two authors were counted as first- and last-authorship. ${ }^{11}$ Co-authorships described all authorships between one first- and one last-authorship. ${ }^{11}$

The female authorship proportion (FAP) is the percentage of female authorships out of all female and male authorships (FAP = Authorships female $/$ Authorships $\mathrm{s}_{\text {female }}+$ male $) .{ }^{12}$

In contrast, the female authorship odds ratio (FAOR) describes the relative distribution of female authors over first-, co- and last-authorships compared to men. ${ }^{12}$ In order to determine the FAOR for first-authorships for instance, the female odds for first-authorships are divided by the male odds for first-authorships $\left(\text { FAOR }_{\text {first }}=\text { Female Odds first } / \text { Male Odds } \text { first } \text { ) }\right)^{12}$ FAORs for co- and last-authorships were calculated in the equivalent way. A FAOR > 1 represents higher female than male odds for the corresponding authorship. ${ }^{25}$ FAORs are determined with a confidence level of $95 \% .{ }^{13}$

To provide a good overview, a FAOR triplet is used to present the relative chance distributions. ${ }^{13}$ A triplet of (,$+=,-$ ), for example, indicates significantly higher ( + ) female odds to secure first-authorships, equal ( $=$ ) odds for co-authorships and significantly lower (-) female odds for lastauthorships, compared to men. ${ }^{13}$

Summarized, the FAP measures the proportion of female authorships, whereas the FAOR gives information about distribution odds over first-, coand last-authorships. ${ }^{11}$

## Prestige Index

The Prestige Index (PI) is a measure of the distribution of prestigious authorships between male and female authors. ${ }^{13}$ Bendels et al. ${ }^{13}$ introduced and defined the Prestige Index "as the prestige-weighted average of the FAOR excess $\varepsilon_{\mathrm{t}}$ that is calculated over all authorship types $t$ [...] with the weighting factor $w_{t}^{\prime \prime}{ }^{12}$ It was computed by $\varepsilon_{t}=w_{t}\left(\right.$ FAOR $\left._{t}-1\right)$ if FAOR $_{t} \geq 1$ and $\varepsilon_{t}=w_{t}\left(1-1 /\right.$ FAOR $\left._{t}\right)$ if FAOR $<1 .^{12}$ Since first- and lastauthorships are associated with a high reputation they are weighted positively with $w_{\text {first }}=w_{\text {last }}=1$, while co-authorships are weighted with $w_{c o}=-1 .{ }^{6,13}$ Thereby the Prestige Index increases with a higher female
odds ratio (OR) for first- or last-authorships and with a lower female OR for co-authorships. ${ }^{13}$ A gender-neutral prestige distribution is indicated by a Prestige Index of 0 , while a positive (negative) Prestige Index states that female authors hold relatively more (less) prestigious authorships than men. ${ }^{13}$

## Analysis of data

Average annual growth rates (AAGR) were determined by computing the mean values of $n$ annual growth rates. ${ }^{10}$ The calculations also served the temporal linear predictions of the article count, the FAP, the FAOR and PI. ${ }^{12}$

In the respective sub-analyzes (countries, journals, subject areas) we computed linear correlations of parameters by applying the Pearson correlation. ${ }^{13}$ We excluded 10 of 113 considered journals from the journalspecific sub-analysis due to a missing 5 -year-impact-factor. Moreover, we applied a Kruskal-Wallis and a post hoc multi-comparison test to test the null hypothesis, whether the not normally distributed citation rates were drawn from the same distribution. ${ }^{12}$ Significance thresholds were set at 0.05 . $^{12}$

## RESULTS

Status quo and temporal development
Female authors are under-represented in pediatric research with a FAP of $46.6 \%$ at the global level (Fig. 1a). Female authors hold $52.0 \%$ first-, $47.6 \%$ co- and $37.5 \%$ last-authorships. FAORs are 1.30 for first-authorships ( $\mathrm{Cl}=1.28-1.32$ ), 1.11 for co-authorships ( $\mathrm{Cl}=$ $1.1-1.12$ ) and 0.63 for last-authorships ( $\mathrm{Cl}=0.62-0.64$ ). The corresponding FAOR-pattern is accordingly characterized by the triplet (,,++- ). Proportionally, women secure less prestigious authorships than men as indicated by a global Prestige Index of -0.13 .

The FAP steadily increased over the last decade from $42.5 \%$ in 2008 to $49.9 \%$ in 2018 with an AAGR of $1.6 \%$. The highest growth rates are found for last- and first-authorships with $2.2 \%$ and $2.0 \%$, respectively (Fig. 1b). The AAGR of female co-authorships is $1.3 \%$.
Female odds to hold first- and last-authorships have increased, while female odds for co-authorships have decreased since 2008. As a result of this drift, the Prestige Index has risen from its minimum of -0.26 in 2009 and has almost approached genderneutrality at -0.05 in 2018.

## Differences across countries

At the country-level, we find a FAP ranging from $21.8 \%$ in Japan, $22.7 \%$ in Saudi Arabia and $33.3 \%$ in Pakistan to $62.8 \%$ in Poland, $63.0 \%$ in Serbia, and $65.9 \%$ in Portugal (Table 1). The Prestige Index varies between a minimum of -0.90 in Italy, -0.80 in Colombia, and -0.77 in Japan, to higher indices of 0.39 in Sweden, 0.42 in Denmark, and then climaxes at a maximum of 0.54 in the Netherlands. Regarding the distribution of authorships, most countries show higher or equal odds ratios for women to be firstor co-authors while men have higher odds to be last-authors. Five countries (Singapore, Kenya, Portugal, Croatia and Tunisia) are characterized by gender-neutrality regarding authorship odds (FAOR triplet $(=,=,=)$ ). Remarkably, Ireland is the only country characterized by higher female odds to secure last-authorships compared to men.
A country's FAP and its Prestige Index are not linearly correlating ( $r=0.18, P>0.05$ ).

## Differences across journals

The FAP range on the journal-level starts at 19.4\% in Journal of Pediatric Orthopedic-Part B, 24.5\% in Journal of NeurosurgeryPediatrics, and $25.3 \%$ in Journal of Pediatric Orthopedics and ascends up to $83.2 \%$ in Journal of Pediatric Nursing-Nursing Care of Children \& Families, 84.2\% in Journal of Perinatal \& Neonatal Nursing, to a maximum of $84.8 \%$ in Journal of Pediatric Health Care (Table 2).
The lowest representation of female authors in prestigious authorships are found in the Italian Journal of Pediatrics ( $\mathrm{PI}=$


Fig. 1 Time trend of female authorships on the global level. a The female authorship odds ratio (FAOR, top) with associated FAOR triplets, the proportion of female authorships (FAP, bottom) and the Prestige Index (PI, bottom) are depicted averaged over time and by year from 2008 to 2018. The average FAP is $46.6 \%$ and has been increasing over time from $42.5 \%$ in 2008 up to $49.9 \%$ in 2018. The negative PI (minimum in 2009) approaches a gender-neutral distribution of renowned authorships. Owing to increasing female odds for first- and last-authorships and decreasing female odds for co-authorships the PI rises up to a maximum of -0.05 in 2018. The FAOR-pattern is almost exclusively characterized by the triplet (,,++- ), indicating significantly higher odds ratios ( + ) for female first- and co-authorships and significantly lower odds ratios (-) for female last-authorships. $\mathbf{b}$ The average annual growth rate (AAGR) of the FAP exhibits a yearly increase of $1.6 \%$ on average with highest growth rates for last- and first-authorships, which are associated with a higher prestige.
-0.77), Journal of Neurosurgery—Pediatrics ( $\mathrm{PI}=-0.64$ ), and Journal of Pediatric Orthopedics ( $\mathrm{PI}=-0.57$ ). In contrast, the best female odds for prestigious authorships are found in the Journal of Pediatric Health Care ( $\mathrm{PI}=0.54$ ), Journal of Pediatric NursingNursing Care of Children \& Families ( $\mathrm{PI}=0.57$ ), and Journal of Perinatal \& Neonatal Nursing ( $\mathrm{PI}=0.64$ ).

Regarding FAORs, the journals are characterized by almost uniform authorship distributions. In 94 out of 113 journals, we find higher or equal female odds for first- and co-authorships and lower odds for women to hold last-authorships. Three journals (Child And Adolescent Mental Health, Developmental Neurorehabilitation and Journal Of Perinatology) stand out with a genderneutral authorship distribution ( $=,=,=$ ). Three other journals (Childs Nervous System, Journal of Pediatric Orthopedic, and Journal of Pediatric Orthopedic-Part B) show the most unfavorable FAOR triplet (,,-+- ). These journals are also characterized by low Prestige Indices ( $\mathrm{PI}=-0.49,-0.57,-0.43$ ) and relatively low FAPs (FAP $=29 \%, 25.3 \%, 19,4 \%)$.

Indeed, the journal's FAP and Prestige Index correlate strongly ( $r(101)=0.74, P<0.01$ ) (Supp. Fig. 3). Interestingly, no linear correlation is found between a journal's 5-Year-Impact-Factor and (a) FAP $(r(101)=0.1, P>0.05)$ or (b) Prestige Index $(r(101)=0.1$, $P>0.05$ ).

## Differences among subject areas

On the level of subject areas, the FAP values yield between 23.3\% in Orthopedics, 30.5\% in Surgery, and 34.8\% Cardiovascular System \& Cardiology and $69.7 \%$ in Rehabilitation, $78.8 \%$ in Nursing, and 83.5\% in Health Care Sciences \& Services (Table 3).

Lowest odds ratios for women to hold prestigious authorships are found in the subject areas Orthopedics ( $\mathrm{PI}=-0.54$ ), Surgery ( $\mathrm{PI}=-0.39$ ), and Sport Sciences ( $\mathrm{PI}=-0.34$ ). In contrast, the highest Prestige Indices are found in Health Care Sciences \& Services (PI =0.12), Public, Environmental \& Occupational Health ( $\mathrm{PI}=0.14$ ), and Nursing ( $\mathrm{Pl}=0.33$ ).

A gender-neutral distribution of prestigious authorships $(\mathrm{PI}=0)$ is found at the subject area Dentistry, Oral Surgery \& Medicine, that interestingly also has an almost balanced FAP of $51.6 \%$.

FAOR patterns are highly uniform at the level of subject areas (,$++/=,-$ ) with significantly higher female odds to secure firstauthorships in almost all subject areas and higher or equal FAORs regarding co-authorships. Men have higher odds to hold lastauthorships in all 38 subject areas. Orthopedics displays the most unfavorable FAOR triplet (,,-+- ), has the lowest FAP of $23.3 \%$ and Prestige Index of -0.54 of this sub-analysis.

A strong correlation between the FAP and the Prestige Index of a subject area is revealed ( $r(36)=0.81, P<0.01$, Fig. 2).

## Female authorships by the number of authors per article

The number of authors per article has little impact on the proportion of female authors. Indeed, the FAP remains essentially stable between $45.7 \%$ for articles with 1-3 authors and $47.0 \%$ for articles with $>12$ authors (Fig. 3). However, we find a tendency of increasing female odds for co-authorships and overall slightly decreasing odds for women to hold last-authorships as the number of authors increases. As a result of this subtle drift, the Prestige Index decreases from -0.1 for articles with 1-3 authors to -0.22 for articles with $>12$ authors. The decline of the Prestige Index displays a female underrepresentation regarding prestigious authorships in multi-author articles. The FAOR triplet remains constant (,,++-$)$.

## Citation and productivity analysis

Only minor differences are found between the citation rates of female and male authors (Fig. 4a). The average citation rate of all articles in this study (including articles of authors with undetected gender) is 10.0 citations/article. Articles with male first-authorships reach highest citation rates of 10.6 citations/article followed by articles with female first-authorships with 10.5 citations/article. The number of authors is crucial for citation rates. Articles with 1-3 authors, for instance, hold an average citation rate of 8.1 citations per article, while articles with $>12$ authors achieve an average citation rate of 17.8 citations/article (Fig. 4b).

In terms of scientific productivity, the study shows that male authors are more productive than female authors. $47 \%$ of the authors in this study's data set are male and hold $53.4 \%$ of the

Table 1. Classification by country.

| Country name | Prestige Index | Proportion of female authorships | FAOR triplet | No. articles | No. authorships |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Netherlands | 0.54 | 48.7\% | (,,+-- ) | 5266 | 18,814 |
| Denmark | 0.42 | 46.1\% | (+, -, -) | 1555 | 4893 |
| Sweden | 0.39 | 54.0\% | $(+,-,-)$ | 3263 | 8958 |
| Norway | 0.28 | 51.9\% | (,,+-- ) | 1434 | 4301 |
| Ireland | 0.16 | 50.8\% | $(=,=,+)$ | 1133 | 3052 |
| Australia | 0.03 | 52.9\% | (,$+=,-$ ) | 6819 | 22,353 |
| Singapore | 0.03 | 48.9\% | ( $=,=,=$ ) | 485 | 1000 |
| Iran | -0.01 | 38.7\% | $(+,=,-)$ | 2751 | 10,531 |
| Finland | -0.03 | 58.7\% | $(+,=,-)$ | 1651 | 6528 |
| India | -0.04 | 37.2\% | $(+,=,-)$ | 6667 | 18,165 |
| Brazil | -0.05 | 59.1\% | ( + , =, -) | 3212 | 12,986 |
| Kenya | -0.05 | 44.1\% | ( $=,=,=$ ) | 327 | 864 |
| Switzerland | -0.07 | 41.8\% | $(+,=,-)$ | 2327 | 6925 |
| Portugal | -0.07 | 65.9\% | $(=,=,=)$ | 776 | 2731 |
| Canada | -0.11 | 50.7\% | $(+,+,-)$ | 9373 | 30,547 |
| South Africa | -0.11 | 46.4\% | ( $=,=,-$ ) | 1240 | 2632 |
| New Zealand | -0.11 | 48.0\% | $(+,=,-)$ | 1083 | 2934 |
| Croatia | -0.11 | 57.2\% | ( $=,=,=$ ) | 305 | 1072 |
| United States | -0.13 | 47.9\% | $(+,+,-)$ | 64186 | 260,726 |
| United Kingdom | -0.13 | 45.7\% | $(+,+,-)$ | 11851 | 30,885 |
| Germany | -0.13 | 36.3\% | $(+,=,-)$ | 6265 | 22,293 |
| Tunisia | -0.14 | 56.7\% | ( $=,=,=$ ) | 199 | 831 |
| Turkey | -0.15 | 46.3\% | $(+,+,-)$ | 7473 | 34,112 |
| Austria | -0.16 | 42.7\% | $(+,=,-)$ | 1265 | 3765 |
| Chile | -0.18 | 55.8\% | ( $=,=,-$ ) | 550 | 1738 |
| Belgium | -0.26 | 50.1\% | $(+,+,-)$ | 1883 | 4955 |
| Pakistan | -0.29 | 33.3\% | ( $=,=,-$ ) | 310 | 823 |
| Egypt | -0.30 | 40.6\% | $(-,+,=)$ | 1296 | 3587 |
| Serbia | -0.31 | 63.0\% | $(=,+,-)$ | 297 | 1207 |
| France | -0.32 | 49.8\% | $(+,+,-)$ | 4088 | 17,225 |
| Mexico | -0.33 | 47.4\% | $(=,+,-)$ | 683 | 2510 |
| Israel | -0.37 | 43.7\% | $(=,+,-)$ | 2685 | 10,009 |
| Poland | -0.37 | 62.8\% | $(=,+,-)$ | 1291 | 4924 |
| Argentina | -0.40 | 59.5\% | $(=,+,-)$ | 786 | 3487 |
| Czech Republic | -0.41 | 47.1\% | $(=,+,-)$ | 445 | 1271 |
| Spain | -0.45 | 55.6\% | $(=,+,-)$ | 3139 | 12,917 |
| Hungary | -0.45 | 44.8\% | $(+,=,-)$ | 409 | 1319 |
| Saudi Arabia | -0.52 | 22.7\% | $(=,+,-)$ | 832 | 1939 |
| Greece | -0.54 | 52.4\% | ( $=,+$, -) | 1150 | 4615 |
| Japan | -0.77 | 21.8\% | (,,++-$)$ | 6012 | 34,293 |
| Colombia | -0.80 | 46.6\% | $(=,+,-)$ | 287 | 777 |
| Italy | -0.90 | 55.2\% | $(=,+,-)$ | 6748 | 33,198 |

The countries are arranged in descending order to their Prestige Index.
authorships, whereas 53\% female authors hold 46.6\% authorships (Fig. 4c). The least productive groups of authors publishing one and two articles are dominated by women. The study overall reveals that $64.7 \%$ of all female authors publish merely one article over the course of their medical career. In contrast, for all higher productivity levels we reveal an overrepresentation of male authors. The group of most productive authors with $>12$ published articles comprises $1.7 \%$ of all female authors and $3.5 \%$ of all male authors (Fig. 4c).

## DISCUSSION

## High participation of women

This descriptive study examines the integration of female scientists by means of scientific authorships in the academic field of pediatrics from 2008 to 2018. In contrast to other medical subdisciplines, ${ }^{9-11,13}$ this analysis reveals that, in fact, the majority of authors in pediatric research are female (53.0\%). Owing to a higher productivity of male authors, women are still slightly underrepresented with a global proportion of female authorships of

Table 2. Classification by journals.

| Journal name | Prestige Index | Proportion of female authorships | FAOR triplet | No. of articles | No. of authorships |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Journal of Perinatal \& Neonatal Nursing | 0.64 | 84.2\% | $(+,=,-)$ | 373 | 894 |
| Journal of Pediatric Nursing—Nursing Care of Children \& Families | 0.57 | 82.3\% | $(+,-,=)$ | 830 | 2823 |
| Journal of Pediatric Health Care | 0.54 | 84.8\% | $(+,=,-)$ | 491 | 1614 |
| Maternal and Child Nutrition | 0.5 | 65.8\% | (,,+-- ) | 784 | 3685 |
| Physical \& Occupational Therapy in Pediatrics | 0.44 | 81.6\% | $(+,-,=)$ | 275 | 1043 |
| Birth-Issues in Perinatal Care | 0.29 | 72.8\% | $(+,-,=)$ | 444 | 1732 |
| Journal of Pediatric and Adolescent Gynecology | 0.28 | 69.7\% | $(+,-,=)$ | 797 | 2869 |
| Journal of Child Health Care | 0.25 | 71.6\% | $(+,=,=)$ | 400 | 1326 |
| International Journal of Pediatrics-Mashhad | 0.23 | 39.6\% | $(+,-,=)$ | 699 | 2711 |
| Pediatrics and Neonatology | 0.21 | 42.8\% | $(+,-,=)$ | 642 | 2142 |
| Pediatric and Perinatal Epidemiology | 0.20 | 56.9\% | (,,+-- ) | 678 | 3618 |
| International Journal of Pediatric Dentistry | 0.19 | 54.9\% | $(+,=,-)$ | 657 | 2541 |
| Developmental Medicine and Child Neurology | 0.18 | 57.2\% | (+, -, -) | 1383 | 6973 |
| European Child \& Adolescent Psychiatry | 0.18 | 54.9\% | (,,+-- ) | 929 | 5006 |
| Journal for Specialists in Pediatric Nursing | 0.16 | 82.4\% | $(+,=,-)$ | 289 | 834 |
| Journal of Adolescent Health | 0.12 | 61.9\% | ( + , -, -) | 2132 | 9897 |
| Pediatric Annals | 0.10 | 55.6\% | $(+,=,-)$ | 782 | 1643 |
| Journal of the Pediatric Infectious Diseases Society | 0.10 | 51.6\% | $(+,=,=)$ | 299 | 1950 |
| International Journal of Pediatric Obesity | 0.09 | 54.3\% | $(+,=,-)$ | 318 | 1326 |
| Pediatric Diabetes | 0.07 | 53.7\% | $(+,=,-)$ | 1104 | 6256 |
| Pediatric Physical Therapy | 0.06 | 72.2\% | $(+,=,-)$ | 452 | 1617 |
| Pediatric Allergy and Immunology | 0.05 | 46.9\% | $(+,=,-)$ | 1008 | 5913 |
| Journal of Tropical Pediatrics | 0.05 | 43.7\% | $(+,=,-)$ | 831 | 3269 |
| Pediatric and Developmental Pathology | 0.05 | 49.6\% | $(+,=,-)$ | 706 | 2901 |
| Pediatric Rheumatology | 0.05 | 55.4\% | $(+,=,-)$ | 430 | 2590 |
| Breastfeeding Medicine | 0.04 | 67.7\% | $(+,=,-)$ | 768 | 2484 |
| Jornal de Pediatria | 0.04 | 64.3\% | $(+,=,-)$ | 661 | 3024 |
| Pediatric Transplantation | 0.03 | 39.1\% | $(+,=,-)$ | 1715 | 9502 |
| Childhood Obesity | 0.03 | 70.4\% | $(+,=,-)$ | 424 | 2098 |
| Pediatric Dentistry | 0.02 | 49.0\% | $(+,=,-)$ | 667 | 2278 |
| Journal of Human Lactation | 0.02 | 75.2\% | $(+,=,-)$ | 628 | 2347 |
| Journal of Pediatric Surgery Case Reports | 0.01 | 30.7\% | $(+,=,-)$ | 707 | 2792 |
| Case Reports in Pediatrics | 0.01 | 47.4\% | $(+,=,-)$ | 322 | 1227 |
| Pediatric Research | 0.00 | 45.5\% | $(+,=,-)$ | 2180 | 13,318 |
| Pediatric Dermatology | -0.01 | 55.5\% | $(+,=,-)$ | 2257 | 8990 |
| Child and Adolescent Mental Health | -0.01 | 63.7\% | $(=,=,=)$ | 320 | 1218 |
| Child and Adolescent Psychiatry and Mental Health | -0.01 | 54.6\% | $(+,=,-)$ | 248 | 1122 |
| Pediatric Blood \& Cancer | -0.03 | 47.2\% | $(+,=,-)$ | 4116 | 26,704 |
| Pediatric Surgery International | -0.03 | 28.9\% | $(+,=,-)$ | 1971 | 8499 |
| Indian Pediatrics | -0.03 | 40.7\% | $(=,=,-)$ | 1390 | 3635 |
| Neuropediatrics | -0.03 | 49.1\% | $(+,=,-)$ | 576 | 2092 |
| Developmental Neurorehabilitation | -0.04 | 62.7\% | ( $=,=,=$ ) | 500 | 2091 |
| Bmc Pediatrics | -0.05 | 52.5\% | $(+,=,-)$ | 2008 | 10,808 |
| Jama Pediatrics | -0.05 | 48.8\% | $(+,=,-)$ | 641 | 4887 |
| Journal of Pediatric Hematology Oncology | -0.06 | 47.7\% | $(+,=,-)$ | 2312 | 11,839 |
| Pediatric Allergy Immunology and Pulmonology | -0.07 | 56.6\% | $(+,=,-)$ | 272 | 1098 |

Table 2. continued

| Journal name | Prestige Index | Proportion of female authorships | FAOR triplet | No. of articles | No. of authorships |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Pediatrics \& Child Health | -0.08 | 57.1\% | $(+,=,-)$ | 434 | 1600 |
| Journal of Clinical Research in Pediatric Endocrinology | -0.08 | 53.0\% | $(+,=,-)$ | 385 | 2024 |
| Journal of Pediatrics and Child Health | -0.09 | 52.1\% | $(+,=,-)$ | 1592 | 6507 |
| Acta Paediatrica | -0.10 | 50.0\% | $(+,=,-)$ | 3027 | 10,700 |
| Pediatric Neurology | -0.11 | 45.9\% | $(+,=,-)$ | 1713 | 8206 |
| Journal of Developmental and Behavioral Pediatrics | -0.11 | 63.3\% | $(+,=,-)$ | 776 | 3718 |
| Archives of Disease in Childhood | -0.12 | 49.6\% | $(+,=,-)$ | 1767 | 6108 |
| Pediatric Critical Care Medicine | -0.12 | 40.8\% | $(+,=,-)$ | 1668 | 9941 |
| Cardiology in the Young | -0.13 | 35.7\% | $(+,=,-)$ | 1935 | 8185 |
| Pediatric Emergency Care | -0.14 | 43.6\% | $(+,+,-)$ | 2078 | 8077 |
| Indian Journal of Pediatrics | -0.14 | 39.6\% | $(=,+,-)$ | 1845 | 5415 |
| Journal of the American Academy of Child and Adolescent Psychiatry | -0.14 | 49.0\% | $(+,=,-)$ | 988 | 6876 |
| Journal of Pediatrics | -0.15 | 49.0\% | $(+,+,-)$ | 4322 | 26,676 |
| Pediatric Nephrology | -0.15 | 46.8\% | $(+,+,-)$ | 1904 | 11,231 |
| Early Human Development | -0.15 | 54.0\% | $(+,=,-)$ | 1651 | 6896 |
| Journal of Perinatal Medicine | -0.15 | 41.9\% | $(+,=,-)$ | 1022 | 5207 |
| Pediatric Radiology | -0.16 | 40.2\% | $(+,+,-)$ | 2323 | 9539 |
| Journal of Child and Adolescent Psychopharmacology | -0.16 | 47.2\% | $(=,+,-)$ | 820 | 4643 |
| Journal of Perinatology | -0.17 | 45.7\% | ( $=,=,=$ ) | 1965 | 1338 |
| Pediatric Clinics of North America | -0.17 | 49.0\% | $(+,=,-)$ | 821 | 1704 |
| Pediatric Hematology and Oncology | -0.17 | 47.9\% | $(=,+,-)$ | 709 | 3514 |
| Journal of Clinical Pediatric Dentistry | -0.17 | 46.7\% | $(=,=,-)$ | 644 | 1125 |
| Pediatrics | -0.18 | 50.8\% | $(+,+,-)$ | 7111 | 42,269 |
| Pediatric Infectious Disease Journal | -0.18 | 48.4\% | $(+,+,-)$ | 3358 | 21,214 |
| Journal of Child Neurology | -0.18 | 50.4\% | $(+,+,-)$ | 2271 | 10,296 |
| Journal of Pediatric Endocrinology \& Metabolism | -0.18 | 52.8\% | $(+,+,-)$ | 1901 | 8693 |
| Turkish Journal of Pediatrics | -0.18 | 52.8\% | $(+,+,-)$ | 1237 | 5906 |
| Hormone Research in Pediatrics | -0.18 | 52.7\% | $(+,=,-)$ | 901 | 4802 |
| Child Psychiatry \& Human Development | -0.18 | 58.6\% | $(+,+,-)$ | 709 | 2909 |
| Fetal and Pediatric Pathology | -0.18 | 50.4\% | $(+,=,-)$ | 506 | 2164 |
| Clinical Pediatrics | -0.19 | 55.5\% | $(+,+,-)$ | 1729 | 6878 |
| Pediatric Pulmonology | -0.2 | 45.3\% | $(+,+,-)$ | 1882 | 9653 |
| European Journal of Pediatric Neurology | -0.20 | 52.9\% | $(+,+,-)$ | 1007 | 5455 |
| Iranian Journal of Pediatrics | -0.20 | 40.0\% | $(=,+,-)$ | 893 | 3332 |
| Ajp Reports | -0.20 | 47.1\% | $(+,=,-)$ | 215 | 986 |
| Archives of Pediatrics \& Adolescent Medicine | -0.21 | 53.1\% | $(+,=,-)$ | 638 | 3231 |
| American Journal of Perinatology | -0.22 | 46.9\% | $(+,+,-)$ | 1579 | 7859 |
| Academic Pediatrics | -0.22 | 61.4\% | $(+,+,-)$ | 864 | 4267 |
| Journal of Pediatric Gastroenterology and Nutrition | -0.24 | 45.3\% | $(+,+,-)$ | 2971 | 16,886 |
| Neonatology | -0.24 | 43.2\% | $(+,+,-)$ | 955 | 4868 |
| Journal of Pediatric Ophthalmology \& Strabismus | -0.24 | 40.2\% | $(+,=,-)$ | 557 | 1932 |
| Children-Basel | -0.24 | 59.4\% | $(=,=,-)$ | 216 | 887 |
| Seminars in Fetal \& Neonatal Medicine | -0.25 | 43.8\% | $(=,=,-)$ | 428 | 835 |
| Pediatric Anesthesia | -0.26 | 39.3\% | $(+,+,-)$ | 1394 | 6292 |
| Pediatrics International | -0.28 | 31.3\% | $(+,+,-)$ | 2356 | 12,664 |
| Journal of Aapos | -0.28 | 43.5\% | $(=,+,-)$ | 1521 | 5776 |

Table 2. continued

| Journal name | Prestige Index | Proportion of female authorships | FAOR triplet | No. of articles | No. of authorships |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Pediatric Cardiology | -0.30 | 34.1\% | $(+,+,-)$ | 2329 | 10,422 |
| International Journal of Pediatric Otorhinolaryngology | -0.31 | 39.5\% | $(+,+,-)$ | 3813 | 14,151 |
| European Journal of Pediatric Surgery | -0.31 | 35.3\% | $(+,=,-)$ | 838 | 2372 |
| European Journal of Pediatrics | -0.33 | 48.4\% | $(+,+,-)$ | 2161 | 11,267 |
| Pediatric Exercise Science | -0.33 | 38.3\% | $(=,+,-)$ | 536 | 2300 |
| Pediatrics and International Child Health | -0.33 | 45.3\% | $(+,=,-)$ | 310 | 1025 |
| Archives of Disease in Childhood-Fetal and Neonatal Edition | -0.35 | 46.9\% | $(=,+,-)$ | 871 | 3454 |
| Frontiers in Pediatrics | -0.36 | 47.6\% | $(=,+,-)$ | 599 | 3149 |
| World Journal of Pediatrics | -0.36 | 38.5\% | $(=,+,-)$ | 587 | 1949 |
| Clinics in Perinatology | -0.36 | 43.3\% | $(=,=,-)$ | 557 | 1163 |
| Congenital Anomalies | -0.39 | 31.6\% | $(=,=,-)$ | 260 | 1357 |
| Journal of Pediatric Surgery | -0.4 | 34.3\% | $(+,+,-)$ | 4960 | 24,729 |
| Pediatric Neurosurgery | -0.41 | 23.4\% | $(=,+,-)$ | 612 | 2411 |
| Seminars in Pediatric Surgery | -0.42 | 31.4\% | $(=,+,-)$ | 500 | 1176 |
| Journal of Pediatric Orthopedics-Part B | -0.43 | 19.4\% | $(-,+,-)$ | 997 | 3700 |
| Childs Nervous System | -0.49 | 29.0\% | $(-,+,-)$ | 2488 | 10,485 |
| Journal of Pediatric Urology | -0.51 | 30.7\% | $(=,+,-)$ | 1557 | 5407 |
| Archivos Argentinos de Pediatria | -0.51 | 59.9\% | $(=,+,-)$ | 392 | 2042 |
| Journal of Pediatric Orthopedics | -0.57 | 25.3\% | $(-,+,-)$ | 1889 | 8288 |
| Journal of Neurosurgery-Pediatrics | -0.64 | 24.5\% | $(=,+,-)$ | 2038 | 10,457 |
| Italian Journal of Pediatrics | -0.77 | 53.4\% | $(=,+,-)$ | 655 | 3727 |

The journals are arranged in descending order to their Prestige Index.
47.9\%. When set in relation to bibliometric data of the whole field of academic science with a FAP of $<30 \%{ }^{17}$ or other recently evaluated medical fields like research about lung-cancer (31.3\%), ${ }^{9}$ prostate cancer (31.7\%), ${ }^{10}$ epilepsy (39.4\%), ${ }^{13}$ or dermatology (43.0\%), ${ }^{11}$ pediatrics stands out with an exceptionally high participation of women. The continuously rising FAP reflects the increasing proportion of women in medicine, particularly in pediatrics. ${ }^{26}$

## Gender-neutrality is partially achieved

Increasing Prestige Indices, climaxing in 2018 with a Prestige Index of -0.05 , suggest an approximation to gender-neutrality regarding the distribution of prestigious authorships. Apparently, the results of the citation analysis also point to gender parity. Not only are articles with women in key authorships cited as often as articles with men in key authorships, but the proportion of female authorships also remains high in multi-author articles, which reach the highest citation rates. In this aspect, pediatric research differs strongly from other scientific fields, in which female authors achieve significantly less citations. ${ }^{12,17}$ This finding speaks against an old boy (citation-) network in pediatric research.

## Female authors yet under-represented in leading positions

Significantly lower female-to-male odds for last-authorships display a lack of women in senior positions in pediatric research. While many young women enter the academic field of pediatrics, ${ }^{27}$ they often leave the scientific career path earlier than men do. ${ }^{1,7}$ This phenomenon is known as the leaking pipeline. ${ }^{28}$ For example, in the US, the most productive country in pediatric research (Supp. Fig. 1), women are over-represented at early-career stages, with $71 \%$ female residents in pediatrics in 2018. ${ }^{1}$ However, the proportion reduces over the next career steps and only few reach senior leadership positions, reflected by a
female proportion of only $27.5 \%$ of the department chairs in pediatrics in 2018. ${ }^{1}$ Career dichotomies like this can be found in most academic disciplines and have been examined in many studies. ${ }^{7,17,28-33}$ As research has shown, one major reason for the imbalance is that female graduate students are relatively less likely than men to aspire leadership positions due to differing life priorities, such as parenthood, ${ }^{28}$ caring for the family, ${ }^{30}$ or a satisfying life-work-balance, ${ }^{34}$ but also due to a lack of role models. ${ }^{35}$

Nevertheless, our study reveals that growth rates for female last-authorships are higher than for other authorship types. Fishman et al. ${ }^{5}$, in contrast, detected higher growth rates for female first-authorships than for last-authorships in their study of three pediatric high-impact journals. This difference raises the question of whether the distribution of authorships is affected by the journal's influence.

However, significantly increasing last-authorship FAORs and high growth rates for FAPs of last-authorships indicate that female scientists, yet under-represented, are on the rise to occupy senior positions in pediatric research.

Lower female productivity due to differing lifestyle priorities Overall, the productivity of a scientist is crucial when it comes to funding, tenure, or promotion. Here, large publication records offer an advantage. ${ }^{30,36,37}$

As van den Besselaar et al. have shown for various scientific disciplines, there are typically no significant productivity differences between male and female authors at early-career stages. ${ }^{30}$ A gender gap with higher male publication counts usually appears in the mid-career phase. ${ }^{30}$ However, at latter career stages, female publication numbers rise and can even exceed those of men. ${ }^{36}$

There are multiple reasons for productivity imbalances. One reason can be found in the female underrepresentation in leading

Table 3. Classification by journals' subject areas.

| Subject area | Prestige Index | Proportion of female authorships | FAOR triplet | No. of articles | No. of authorships |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Nursing | 0.33 | 78.8\% | ( + , -, -) | 3520 | 11,656 |
| Public, Environmental \& Occupational Health | 0.14 | 60.5\% | (+, -, -) | 3057 | 14,060 |
| Health Care Sciences \& Services | 0.12 | 83.5\% | ( + , =, -) | 539 | 1709 |
| Allergy | 0.07 | 48.4\% | ( + , =, -) | 1299 | 7047 |
| Tropical Medicine | 0.06 | 43.5\% | ( + , =, -) | 1005 | 3348 |
| Psychology | 0.05 | 57.6\% | ( + , =, -) | 7334 | 30,665 |
| Rehabilitation | 0.04 | 69.7\% | ( + , =, -) | 1338 | 4970 |
| Transplantation | 0.03 | 39.1\% | ( + , =, -) | 1715 | 9502 |
| Obstetrics \& Gynecology | 0.02 | 55.5\% | ( + , =, -) | 10,779 | 37,190 |
| Rheumatology | 0.01 | 55.3\% | ( + , =, - ) | 450 | 2626 |
| Dentistry, Oral Surgery \& Medicine | 0.00 | 51.6\% | ( + , =, -) | 2602 | 6430 |
| Psychiatry | -0.02 | 52.5\% | ( + , =, -) | 4180 | 22,095 |
| Dermatology | -0.02 | 55.4\% | ( + , =, -) | 2294 | 9044 |
| Pathology | -0.04 | 50.1\% | ( + , $=,-$ ) | 1226 | 5104 |
| Hematology | -0.06 | 47.3\% | (,,++- ) | 7298 | 42,329 |
| Oncology | -0.07 | 47.3\% | $(+,+,-)$ | 7538 | 42,921 |
| Nutrition \& Dietetics | -0.07 | 48.9\% | (,$+=,-$ ) | 4001 | 20,944 |
| Behavioral Sciences | -0.07 | 63.7\% | $(+,=,-)$ | 838 | 3807 |
| Immunology | -0.12 | 48.3\% | (,,++- ) | 4722 | 28,293 |
| Endocrinology \& Metabolism | -0.12 | 52.8\% | $(+,+,-)$ | 4526 | 22,292 |
| Pediatrics | -0.13 | 46.6\% | $(+,+,-)$ | 156,642 | 690,436 |
| Emergency Medicine | -0.14 | 43.7\% | $(+,+,-)$ | 2106 | 8121 |
| Infectious Diseases | -0.16 | 48.6\% | $(+,+,-)$ | 3878 | 23,750 |
| General \& Internal Medicine | -0.16 | 41.0\% | ( + , =, -) | 2065 | 10,834 |
| Radiology, Nuclear Medicine \& Medical Imaging | -0.17 | 40.1\% | (+, +, -) | 2527 | 10,049 |
| Pharmacology \& Pharmacy | -0.18 | 46.6\% | ( $=,+,-$ ) | 1130 | 5571 |
| Respiratory System | -0.22 | 46.1\% | (,,++- ) | 2534 | 11,456 |
| Neurosciences \& Neurology | -0.23 | 41.5\% | (,,++- ) | 13,208 | 59,319 |
| Cardiovascular System \& Cardiology | -0.23 | 34.8\% | (,,++- ) | 4635 | 19,496 |
| Gastroenterology \& Hepatology | -0.24 | 45.3\% | (,,++- ) | 3016 | 16,968 |
| Anesthesiology | -0.24 | 39.7\% | $(+,+,-)$ | 1507 | 6484 |
| Ophthalmology | -0.29 | 42.5\% | $(+,+,-)$ | 2133 | 7802 |
| Otorhinolaryngology | -0.32 | 39.3\% | $(+,+,-)$ | 3884 | 14,243 |
| Urology \& Nephrology | -0.33 | 41.4\% | (,,++- ) | 3607 | 16,945 |
| Physiology | -0.33 | 38.3\% | ( $=,+,-$ ) | 536 | 2300 |
| Sport Sciences | -0.34 | 37.9\% | ( $=,+,-$ ) | 615 | 2426 |
| Surgery | -0.39 | 30.4\% | $(+,+,-)$ | 13,740 | 60,582 |
| Orthopedics | -0.54 | 23.3\% | $(-,+,-)$ | 3373 | 12,859 |

The subject areas are arranged in descending order to their Prestige Index.
positions. Since higher academic rank is associated with high levels of supervision and publication of scientific work and participation in (citation-) networks, ${ }^{11,36}$ female underrepresentation leads to fewer authorships. ${ }^{38}$ Another reason for productivity differences might be found in the fact that young female scientists are often absent from work for at least a small period of time due to child bearing. ${ }^{30}$ In addition, female pediatricians have more household responsibilities than their male colleges ${ }^{39}$ and more than one-third of female pediatricians in the US work part-time. ${ }^{40}$ Interestingly, the gender-related difference in part-time work accentuates at ages $40-49$, with $40 \%$ of the female and only $5 \%$ of
the male pediatricians working part-time. ${ }^{40}$ This period matches the less productive mid-career phase. In summary, the underrepresentation in leading positions and differing female lifestyle priorities are two major reasons for lower female productivity.

## Socio-cultural factors cause region-specific differences

We revealed large region-specific differences of gender disparities in pediatric research. The findings are consistent with those of other medical disciplines. ${ }^{9-12,25}$ The Netherlands and the Scandinavian countries Sweden, Norway and Denmark lead the PI rankings in several medical disciplines, ${ }^{9,11,12}$ indicating that they


Fig. 2 Correlation of parameters in subject areas. The Prestige Index and the proportion of female authorships (FAP) are strongly correlated.
provide the best career opportunities for female researchers. ${ }^{5}$ The opposite applies to countries such as Japan, Italy, and Greece, most of which are at the bottom of the PI rankings. ${ }^{9-12,25}$

Since these findings also correlate with the Global Gender Gap Report (GGGR), ${ }^{41}$ it can be assumed that regional differences are not founded in characteristics of pediatric research, but are rather due to socio-cultural characteristics of the respective countries. ${ }^{13}$ Japan, for example, is in position 110 of all 149 countries in the GGGR 2018 and in position 40 of 42 of our study. The extremely low FAP of only $21.8 \%$ and a Prestige Index of -0.77 in Japan can most likely be seen as an expression of the country's patriarchal and male-dominated structures. ${ }^{31}$

Interestingly, no correlation of a country's FAP and Prestige Index can be determined ( $r=0.18, P>0.05$ ), suggesting that a country with a high proportion of female authors might not necessarily offer good career opportunities for female scientists. In Italy, for instance, female authors predominate with a FAP of $55.2 \%$, but the country provides the worst female prospects in our study with a Prestige Index of -0.9 . Accordingly, the theory of critical mass, postulating that the structures of a group change in favor of a minority as soon as it exceeds a critical mass, ${ }^{42}$ does not apply on the country-level due to the strong influence of socio-cultural factors.

## Homogeneous structures in pediatric sub-disciplines

The analysis reveals that, unsurprisingly, some pediatric subdisciplines are clearly male-dominated (e.g., Orthopedics FAP = $23.3 \%$ ), while others are female-dominated (e.g., Nursing FAP $=$ $78.8 \%$ ). These findings agree with the gender distribution of the respective subjects in adult medicine. ${ }^{1,43}$ Fischer et al. ${ }^{19}$ found an underrepresentation of women in Pediatric Orthopedics, too. ${ }^{19}$ However, they detected an increasing proportion of female firstauthors from $13.5 \%$ in 2005 to $25.6 \%$ in 2015, indicating that women are rising in this male-dominated sub-discipline. ${ }^{19}$

Regardless of the large FAP range of pediatric sub-disciplines $(\Delta \mathrm{FAP}=60.2 \%)$, there is a high homogeneity in terms of publication opportunities. FAOR patterns show higher female odds to hold firstauthorships and lower female odds to hold last-authorships in 34 of 38 subject areas compared to male odds. The high level of uniformity is also reflected by a relatively small PI rage ( $\Delta \mathrm{PI}=0.87$ ). The findings suggest that research group structures in almost all pediatric sub-disciplines are characterized by mainly female earlycareer researchers and mainly male leaders.

The strong correlation between the FAP and Prestige Index of subject areas ( $r=0.81, P<0.01$ ) implies that with an increasing proportion of female authors, the female odds to hold prestigious authorships rise in the respective subject area. In this case, the finding is consistent with the theory of critical mass. ${ }^{42}$

## Female integration at the journal-level

Journals differ strongly in terms of the proportion of female authors. With a FAP range of $\triangle \mathrm{FAP}=65.4$ the variation of journals is even higher than of subject areas. Nevertheless, again, we find a high degree of homogeneity regarding publication opportunities


Fig. 3 Female authorships by authors per article. With an increasing number of authors per article, the proportion of female authorships (FAP) remains almost constant. In contrast, the Prestige Index (PI) decreases in multi-authored articles due to a female disadvantaged shift of prestigious authorships.
with mainly higher female odds ratios for first-authorships and higher male odds ratios for last-authorships. The parallels between pediatric sub-disciplines and journals can be explained by the assignment of subjects to partially subject-specific journals. Interestingly, on the journal-level, the PI values diverge more strongly ( $\Delta \mathrm{PI}=1.41$ ) with deviations both upwards and downwards than on the subject-level. We suggest that socio-cultural factors lead to the stronger deviation, as some of the examined journals are country-specific. The lowest Prestige Index in the journal-specific analysis, for example, is found in the Italian Journal of Pediatrics with a PI of -0.77 , which is consistent with the country-specific analysis pointing out Italy as the country with the lowest Prestige Index.

The discovered correlation between the FAP and Prestige Index on the journal-level ( $r=0.74, P<0.01$ ) reveals the influence that the female share has on the distribution of prestigious authorships in journals.

The 5-Year-Impact-Factor of a journal, however, does not correlate linearly with the FAP $(r=0.1 P>0.05)$ nor the Prestige Index ( $r=0.1 P>0.05$ ), indicating that the impact of a journal does not affect the integration of female scientists in pediatric research.

## Outlook

In contrast to other fields, ${ }^{7,12}$ the temporal development of pediatric research displays an explicit progression of increasing female odds to secure first- and last-authorships combined with concurrent decreasing female odds for co-authorships. A linear projection of the obtained data forecasts a rising FAP and increasing FAORs for first- and last-authorships in combination with female odds for co-authorships dropping below one (Supp. Fig. 2). This projection results in a switch of the FAOR triplet from $(+,+,-)$ to $(+,=,-)$ and predicts a FAP of $54.0 \%$ and a positive Prestige Index of 0.05 in 2023. Thus, further improvement in career opportunities for women in pediatric research can be expected. However, leading positions will still be predominantly occupied by men in the coming years.

## Methodical limitations

The applied method offers the possibility to algorithmically analyze high amounts of data independent of the examiner. As


Fig. 4 Gender-specificity of citations and scholarly productivity. a (left) The descending ordered citation rates reveal only marginal differences between the two genders. The citation rates range from 10.1 citations/article (male first-author) to 10.6 citations/article (male lastauthor). The dotted line marks the average citation rate of 10.0 citations/article. a (right) The analysis of combined authorships reveals that interestingly, mixed key authorships reach significantly higher citation rates than articles with unisex key authorships. Articles published by only one author attract lowest citation rates. $\mathbf{b}$ The average citation rates by authors per article are depicted ungrouped (bar) and grouped by gender of the key authorships (lines). Citation rates increase with the number of contributing authors. Gender-specific differences in citation rates are minor. c (left) Articles per author by gender. Female authors are over-represented in the groups of authors with only one or two published articles, while male authors dominate all other subgroups. c (right) The higher productivity of male authors is shown by the fact that $53.4 \%$ of all authorships are held by $47 \%$ male authors.
it is frequently used, values like gender-specific odds ratios or Prestige Indices can easily be compared to other medical disciplines.

For articles published before 2007, the method is not feasible, since the author names were predominantly abbreviated with initial letters, making first-name-based gender determination impracticable. ${ }^{25}$ Shared first- or last-authorships cannot be detected by Gendermetrics.Net and were therefore not taken into account. ${ }^{11}$ As already mentioned by other studies, ${ }^{12,17,25}$ variables, such as the academic rank, employment status and age of the author, were not examined due to lack of information. Moreover, it should be noted that also the profession of the author is not considered. Since journals assigned to pediatrics build the data basis, articles of pediatrics faculty published in non-pediatric journals are not included in the analysis. Furthermore, a change of the last name owing to marriage could not be taken into account in the articles-per-author sub-analysis. In addition, China and South Korea were excluded from the country-specific analysis because of the large proportion of unisex names.

The limitations that result from the software-supported analysis can be addressed in further research by individual investigations, particularly on author attributes. Besides, a disclosure of the authors gender in the submitting process could support investigations on gender disparities.

## CONCLUSION

In the present study, it was shown that the integration of female scientists is advanced in pediatric research, compared to other scientific disciplines. ${ }^{12,17}$ With nearly balanced publication counts between female and male authors in 2018, similar citation rates, and a Prestige Index which is approaching an almost equal
distribution of prestige-associated authorships, the gender gap has narrowed over time. Nevertheless, for pediatric research, as for most scientific fields, ${ }^{7,12}$ a gender-based career-dichotomy could be observed, with relatively more female first-authors at earlycareer stages and mainly male last-authors in leadership positions. According to linear projections, improving career opportunities for women in pediatric research can be expected in the coming years. Further investigations in the future will reveal whether a ceiling effect occurs or whether gender parity is achieved in pediatric research. It is up to working groups and journals to question their structures and discuss if or how they want to contribute to closing the gender gap.

## REFERENCES

1. AAMC. The State of Women in Academic Medicine 2018-2019: Exploring Pathways to Equity. https://store.aamc.org/the-state-of-women-in-academic-medicine-2018-2019-exploring-pathways-to-equity.html (2020).
2. DeAngelis, C. Women in pediatrics. JAMA Pediatr. ume 169, 106-107 (2015).
3. Cohen, M. B. et al. Pediatric chair turnover and demographics. J. Pediatr. https:// doi.org/10.1016/j.jpeds.2021.08.003 (2021).
4. Dance, A. Authorship: who's on first? Nature 489, 591-593 (2012).
5. Fishman, M., Williams, W. A., Goodman, D. M. \& Ross, L. F. Gender differences in the authorship of original research in pediatric journals, 2001-2016. J. Pediatr. 191, 244-249.e1 (2017).
6. Tscharntke, T., Hochberg, M. E., Rand, T. A., Resh, V. H. \& Krauss, J. Author sequence and credit for contributions in multiauthored publications. PLoS Biol. 5, e18 (2007).
7. West, J. D., Jacquet, J., King, M. M., Correll, S. J. \& Bergstrom, C. T. The role of gender in scholarly authorship. PLoS ONE 8, e66212 (2013).
8. Amering, M., Schrank, B. \& Sibitz, I. The gender gap in high-impact psychiatry journals. Acad. Med. 86, 946-952 (2011).
9. Bendels, M. H. K., Brüggmann, D., Schöffel, N. \& Groneberg, D. A. Gendermetrics of cancer research: results from a global analysis on lung cancer. Oncotarget 8, 101911-101921 (2017).
10. Bendels, M. H. K., Costrut, A. M., Schöffel, N., Brüggmann, D. \& Groneberg, D. A. Gendermetrics of cancer research: results from a global analysis on prostate cancer. Oncotarget 9, 19640-19649 (2018).
11. Bendels, M. H. K. et al. Gender disparities in high-quality dermatology research: a descriptive bibliometric study on scientific authorships. BMJ Open 8, e020089 (2018).
12. Bendels, M. H. K., Müller, R., Brueggmann, D. \& Groneberg, D. A. Gender disparities in high-quality research revealed by Nature Index journals. PLOS ONE 13, e0189136 (2018).
13. Bendels, M. H. K. et al. Gender equality in academic research on epilepsy-a study on scientific authorships. Epilepsia 58, 1794-1802 (2017).
14. Desai, N., Veras, L. V. \& Gosain, A. Using bibliometrics to analyze the state of academic productivity in US pediatric surgery training programs. J. Pediatr. Surg. 53, 1098-1104 (2018).
15. Kramer, P. W., Kohnen, T., Groneberg, D. A. \& Bendels, M. H. K. Sex disparities in ophthalmic research: a descriptive bibliometric study on scientific authorships. JAMA Ophthalmol. 137, 1223 (2019).
16. Mueller, C. M., Gaudilliere, D. K., Kin, C., Menorca, R. \& Girod, S. Gender disparities in scholarly productivity of US academic surgeons. J. Surg. Res. 203, 28-33 (2016).
17. Larivière, V., Ni, C., Gingras, Y., Cronin, B. \& Sugimoto, C. R. Bibliometrics: global gender disparities in science. Nature 504, 211-213 (2013).
18. Menzel, L. C., Kramer, P. W., Groneberg, D. A. \& Bendels, M. H. K. Gender disparities in authorships of Alzheimer's disease and dementia research articles. J. Alzheimers Dis. 70, 1143-1152 (2019).
19. Fischer, J. P. et al. Historical analysis of bibliometric trends in the journal of pediatric orthopaedics with a particular focus on sex. J. Pediatr. Orthop. 38, e168-e171 (2018).
20. Otero, P., Marcos, C. \& Ferrero, F. Female authorship in Latin American pediatric journals. Arch. Argent. Pediatr. 115, 580-583 (2017).
21. Filardo, G. et al. Trends and comparison of female first authorship in high impact medical journals: observational study (1994-2014). BMJ i847 https://doi.org/ 10.1136/bmj. 847 (2016).
22. Jagsi, R. et al. The "Gender Gap" in authorship of academic medical literature-a 35-year perspective. N. Engl. J. Med. 355, 281-287 (2006).
23. Silver, J. K. et al. Assessment of Women Physicians Among Authors of PerspectiveType Articles Published in High-Impact Pediatric Journals. JAMA Netw. Open 1, e180802 (2018). https://doi.org/10.1001/jamanetworkopen.2018.0802.
24. Bendels, M. H. K., Brüggmann, D., Schöffel, N. \& Groneberg, D. A. Gendermetrics. NET: a novel software for analyzing the gender representation in scientific authoring. J. Occup. Med. Toxicol. 11, https://doi.org/10.1186/s12995-016-0133-6 (2016).
25. Bendels, M. et al. Der gendergap in der medizinischen Spitzenforschung: eine szientometrische analyse zur repräsentation weiblicher autoren in hochrangigen medizinischen journalen. DMW-Dtsch. Med. Wochenschr. 143, e85-e94 (2018).
26. AAMC. 2015-2016 The State of Women in Academic Medicine Statistics. https:// www.aamc.org/data-reports/faculty-institutions/data/2015-2016-state-women-academic-medicine-statistics.
27. AAMC. Statistics-Group on Women in Medicine and Science (GWIMS)-Member Center. https://www.aamc.org/members/gwims/statistics/.
28. van Anders, S. M. Why the academic pipeline leaks: fewer men than women perceive barriers to becoming professors. Sex. Roles 51, 511-521 (2004).
29. Raj, A. et al. Longitudinal analysis of gender differences in academic productivity among medical faculty across 24 medical schools in the United States. Acad. Med. 91, 1074-1079 (2016).
30. van den Besselaar, P. \& Sandström, U. Gender differences in research performance and its impact on careers: a longitudinal case study. Scientometrics 106, 143-162 (2016).
31. Matsui, T., Sato, M., Kato, Y. \& Nishigori, H. Professional identity formation of female doctors in Japan - gap between the married and unmarried. BMC Med. Educ. 19, https://doi.org/10.1186/s12909-019-1479-0 (2019).
32. Fridner, A. et al. Possible reasons why female physicians publish fewer scientific articles than male physicians-a cross-sectional study. BMC Med. Educ. 15, 67 (2015).
33. Macaluso, B., Larivière, V., Sugimoto, T. \& Sugimoto, C. R. Is science built on the shoulders of women? a study of gender differences in contributorship. Acad. Med. 91, 1136-1142 (2016).
34. Carr, P. L., Gunn, C. M., Kaplan, S. A., Raj, A. \& Freund, K. M. Inadequate progress for women in academic medicine: findings from the national faculty study. J. Women's Health 24, 190-199 (2015).
35. Surawicz, C. M. Women in leadership: why so few and what to do about it. J. Am. Coll. Radiol. 13, 1433-1437 (2016).
36. Reed, D. A., Enders, F., Lindor, R., McClees, M. \& Lindor, K. D. Gender differences in academic productivity and leadership appointments of physicians throughout academic careers. Acad. Med. 86, 43-47 (2011).
37. Tescione, S. M. Research news and comment: a woman's name: implications for publication, citation, and tenure. Educ. Res. 27, 38-42 (1998).
38. Tschudy, M. M., Rowe, T. L., Dover, G. J. \& Cheng, T. L. Pediatric academic productivity: pediatric benchmarks for the h-and g-Indices. J. Pediatr. 169, 272-276 (2016).
39. Starmer, A. J. et al. Gender discrepancies related to pediatrician work-life balance and household responsibilities. Pediatrics 144, e20182926 (2019).
40. Cull, W. L., Frintner, M. P., O'Connor, K. G. \& Olson, L. M. Pediatricians working part-time has plateaued. J. Pediatr. 171, 294-299 (2016).
41. World Economic Forum. The Global Gender Gap Report 2018. http://www3. weforum.org/docs/WEF_GGGR_2018.pdf. (2018).
42. Etzkowitz, H., Kemelgor, C., Neuschatz, M., Uzzi, B. \& Alonzo, J. The paradox of critical mass for women in science. Science 266, 51-54 (1994).
43. Kaiser Family Foundation. Total Number of Nurse Practitioners, by Gender. https:// www.kff.org/other/state-indicator/total-number-of-nurse-practitioners-by-gender (2020).

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## AUTHOR CONTRIBUTIONS

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