



# Emergency medical services utilisation among febrile children attending emergency departments across Europe: an observational multicentre study

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## Abstract

Children constitute 6–10% of all patients attending the emergency department (ED) by emergency medical services (EMS). However, discordant EMS use in children occurs in 37–61% with fever as an important risk factor. We aimed to describe EMS utilisation among febrile children attending European EDs. This study is part of an observational multicentre study assessing management and outcome in febrile children up to 18 years (MOFICHE) attending twelve EDs in eight European countries. Discordant EMS use was defined as the absence of markers of urgency including intermediate/high triage urgency, advanced diagnostics, treatment, and admission in children transferred by EMS. Multivariable logistic regression analyses were performed for the association between (1) EMS use and markers of urgency, and (2) patient characteristics and discordant EMS use after adjusting all analyses for the covariates age, gender, visiting hours, presenting symptoms, and ED setting. A total of 5464 (15%, range 0.1–42%) children attended the ED by EMS. Markers of urgency were more frequently present in the EMS group compared with the non-EMS group. Discordant EMS use occurred in 1601 children (29%, range 1–59%). Age and gender were not associated with discordant EMS use, whereas neurological symptoms were associated with less discordant EMS use (aOR 0.2, 95%CI 0.1–0.2), and attendance out of office hours was associated with more discordant EMS use (aOR 1.6, 95%CI 1.4–1.9). Settings with higher percentage of self-referrals to the ED had more discordant EMS use ( $p < 0.05$ ).

**Conclusion:** There is large practice variation in EMS use in febrile children attending European EDs. Markers of urgency were more frequently present in children in the EMS group. However, discordant EMS use occurred in 29%. Further research is needed on non-medical factors influencing discordant EMS use in febrile children across Europe, so that pre-emptive strategies can be implemented.

## What is Known:

- Children constitute around 6–10% of all patients attending the emergency department by emergency medical services.
- Discordant EMS use occurs in 37–61% of all children, with fever as most common presenting symptom for discordant EMS use in children.

## What is New:

- There is large practice variation in EMS use among febrile children across Europe with discordant EMS use occurring in 29% (range 1–59%), which was associated with attendance during out of office hours and with settings with higher percentage of self-referrals to the ED.
- Future research is needed focusing on non-medical factors (socioeconomic status, parental preferences and past experience, healthcare systems, referral pathways, out of hours services provision) that influence discordant EMS use in febrile children across Europe.

**Keywords** Emergency medical services · Emergency care · Children · Fever · Paediatrics

## Abbreviations

|     |                      |
|-----|----------------------|
| aOR | Adjusted odds ratio  |
| CI  | Confidence interval  |
| CRP | C-reactive protein   |
| ED  | Emergency department |

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|         |                                                                                                            |
|---------|------------------------------------------------------------------------------------------------------------|
| GP      | General practitioner                                                                                       |
| ILSI    | Immediate life-saving interventions                                                                        |
| MOFICHE | Management and Outcome of Fever in children in Europe                                                      |
| OOH     | Out of office hours                                                                                        |
| PERFORM | Personalized Risk assessment in Febrile illness to Optimize Real-life Management across the European Union |
| PICU    | Paediatric intensive care unit                                                                             |
| WBC     | White blood cell                                                                                           |
| UK      | United Kingdom                                                                                             |

## Introduction

Emergency medical services (EMS) provide urgent out-of-hospital treatment and stabilisation for serious illness and injury, and transport patients to the emergency department (ED) for definitive care [1]. It was primarily developed to provide immediate care to adults with traumatic injury or cardiac arrest for whom fast intervention or transport is life-saving [2, 3]. However, in the 1980s children were acknowledged as a representative group of paramedic calls and constituted 6–10% of all patients transported to the ED by EMS [2–5]. The majority of children are in the trauma category, but unlike adults, fever and reassurance are common reasons for EMS use [5, 6]. Fever in children accounts for 20% of all paediatric emergency visits with the majority having a self-limiting viral respiratory illness [7, 8].

Currently, there is a high pressure on EMS and EDs are overcrowded [9, 10]. Therefore, it is important that EMS is only used by patients who truly need this [11]. In literature there is no universal definition for discordant EMS use and most often discordance is assigned retrospectively by clinicians or based on resource utilisation [6, 12]. The estimated prevalence of discordant EMS use in children is 37–61% [13, 14]. Risk factors for discordant EMS use in children are lack of private transport, being first-time parents, low level of parental education, and parental anxiety [6]. Fever is reported as the most common presenting symptom for discordant EMS use in children [15]. This might imply that it is difficult for parents and healthcare professionals to assess disease severity in febrile children. Furthermore, discordant EMS use can also be influenced by non-medical factors such as the healthcare system in place [16].

Discordant EMS use leads to high medical costs, shortage of EMS, and high work pressure for EMS and ED staff [17]. Data from a large international cohort on febrile children attending EDs by EMS is lacking, and discordant EMS use might occur [15]. Therefore, the aim of this study is to describe EMS utilisation in febrile children attending EDs across Europe.

## Methods

### Study design and setting

This is a secondary analysis of the MOFICHE study (Management and Outcome of Fever in children in Europe), which is part of the PERFORM project (Personalized Risk assessment in Febrile illness to Optimize Real-life Management across the European Union) [18, 19]. The MOFICHE study is an observational multicentre study evaluating management and outcome of febrile children in twelve EDs across eight European countries (Austria, Germany, Greece, Latvia, the Netherlands  $n=3$ , Slovenia, Spain, UK  $n=3$ ). The hospital characteristics are described in a previous study [20] (Appendix A). Approval by the ethics committees of the participating hospitals was obtained. The need for informed consent was waived and in the UK settings an additional opt-out mechanism was in place.

### Study population

Children < 18 years with fever ( $\geq 38^\circ\text{C}$ ) at the ED or with a history of fever (within 3 days before ED visit) were included in MOFICHE. For this secondary analysis, febrile children with a known way of transportation defined as EMS versus non-EMS were included. Children with missing data on triage urgency and admission were excluded.

### Data collection

Data of 38,480 febrile children attending the ED were collected as part of routine clinical care and extracted from electronic health records by the local research team (January 2017–April 2018). Data collected included patient characteristics (age, gender, presenting symptoms, comorbidity (chronic condition expected to last at least 1 year [21])), referral status, visiting hours, markers of disease severity (triage urgency, vital signs, ill appearance), diagnostics (laboratory tests, imaging), treatment (immediate life-saving interventions (ILSI), oxygen therapy), and disposition (admission to ward or paediatric intensive care unit (PICU)). Focus of infection and cause of infection were retrospectively assigned by the research team. Focus of infection was categorised into respiratory tract, gastrointestinal tract, urinary tract, sepsis/meningitis, and other (e.g. skin/soft tissue infection, undifferentiated fever, inflammatory illness). Cause of infection was categorised into presumed bacterial, unknown bacterial/viral, presumed, viral and other according to a previously published phenotyping flowchart [19] (Appendix B). Presenting symptoms were categorised into neurological, respiratory, gastrointestinal, and other symptoms. Neurological

symptoms included meningeal signs, focal neurological signs, or seizures. Respiratory symptoms included coughing or other signs of respiratory tract infection, such as runny nose, sore throat, and sneezing. Gastrointestinal symptoms included vomiting or diarrhoea. Children with more than one presenting symptom were classified according to a priority system with neurological symptoms having priority. If children had both respiratory and gastrointestinal symptoms, they were categorised based on focus of infection, meaning that respiratory tract infections were allocated to the respiratory group and children with a gastrointestinal focus of infection were allocated to the gastrointestinal group. If children had another focus of infection, none of these three symptom groups, or missing data on these three symptom groups, they were categorised as other. Out of office hours (OOH) was defined as between 5 PM and 8 AM on weekdays or the weekends. Referral status was categorised into EMS, referral by a medical specialist or general practitioner (GP), other (e.g. referral by other hospital), and self-referral. Triage urgency was divided into low and intermediate/high triage urgencies. Abnormal vital signs, including tachypnoea, tachycardia, and hypoxia, were based on age-dependent cut-off values according to the Advanced Pediatric Life Support guideline of 2017 [22]. Diagnostic tests were categorised into simple and advanced diagnostics. Simple diagnostics included C-reactive protein (CRP), white blood cell (WBC) count, urinalysis, urine culture, and respiratory test or culture. Advanced diagnostics included any kind of imaging, blood culture, and lumbar puncture. ILSI consist of five categories [23] (Appendix C).

For this substudy, a questionnaire on background information on EMS was sent out to the principal investigator per country. This questionnaire contributed to additional qualitative information next to the clinical information in MOFICHE. It consisted of one open question and four multiple choice questions concerning how the whole EMS process looks like, who can call the emergency number, what happens when EMS arrive at the patient, where the EMS can transport the patient to, and what the practical reasons for EMS use are (Appendix D).

## Outcome measures

We defined way of transportation as transport by EMS versus non-EMS, which we created based on registered referral status. The non-EMS group contained the other categories of referral status. The definition of discordant EMS use was based on previous literature and expert opinions of the local research team including paediatricians [6]. Discordant EMS use was defined as the absence of markers of urgency including intermediate/high triage

urgency, advanced diagnostics, oxygen therapy, ILSI, and admission. If none of these five criteria was met, EMS use was defined as discordant.

## Data analysis

Descriptive statistics were used for patient characteristics and management stratified by EMS use. We performed Mann–Whitney U and chi-squared testing for continuous and categorical data assuming not normally distributed data. Multivariable logistic regression analysis was performed for the association between EMS use and markers of urgency with adjustment for the confounders age, gender, visiting hours, presenting symptoms, and ED setting. Additionally, multivariable logistic regression analysis was performed for the association between patient characteristics (age, gender, presenting symptoms, and visiting hours) and discordant EMS use. We created four age categories:  $< 1$ ,  $1 < 5$ ,  $5 < 12$ ,  $12 < 18$  years. Results are shown as adjusted odds ratios (aOR) with a 95% confidence interval (CI). We explored the association between discordant EMS use and (1) markers of urgency and (2) proportion self-referrals as we hypothesised these as important predictors of discordant EMS use. A heat map was created on discordant EMS use and markers of urgency per ED setting, and chi-squared testing was used for the hospital characteristic self-referral rate and discordant EMS use. ED settings were dichotomised in high versus low self-referral ED settings based on the prevalence of 57% self-referrals in the MOFICHE population. A sensitivity analysis was performed to simulate the situation where 20% of EMS transports are initiated by other healthcare professionals, e.g. the GP [24]. The percentage of discordant EMS use was then calculated in a random 80% children per ED setting. Statistical analyses were performed using SPSS software version 25 with a  $p$ -value below 0.05 considered statistically significant. Qualitative data are reported descriptively to interpret the findings of the quantitative analyses.

## Results

### Patient characteristics

A total of 37,315 children were included, and 36,156 children were used for analyses after exclusion of children with missing data on triage urgency (3%) and hospital admission (0.1%). Fifteen percent ( $N = 5464$ ) of the children were transported by EMS (range 0.1–42%) (Appendix F). Children in the EMS group more often attended the ED during OOH (76% vs 65%), were more frequently triaged as intermediate/high urgent (56% vs 32%), described as ill appearing (29% vs 13%) and had more abnormal vital

signs compared to children in the non-EMS group. Neurological symptoms were more common in the EMS group, whereas respiratory symptoms were more common in the non-EMS group. The EMS group received more extensive management in terms of diagnostic tests, treatment, and admission. Focus and cause of infection were comparable in the two groups (Table 1).

Four markers of urgency including intermediate/high triage urgency, oxygen therapy, ILSI, and admission were significantly more frequently present in the EMS group compared to the non-EMS group. Advanced diagnostics was comparable in the EMS group and the non-EMS group (Fig. 1, Appendix G).

### Discordant EMS use

Of the 5464 children who were transported by EMS, 1601 children (29%) had discordant EMS use ranging from 1 to 59% across the EDs (Fig. 2, Appendix F). Since the most important markers of urgency are intermediate/high triage urgency and admission, we first evaluated the proportion of discordant EMS use by defining discordant EMS use as the absence of these two main markers of urgency separately. This resulted in 2427 children (44%) and 3509 children (64%), respectively, having discordant EMS use. When combining the absence of these two markers of urgency for the definition of discordant EMS use, 1865 children (34%) had discordant EMS use. Lastly, when the other three markers of urgency (advanced diagnostics, oxygen therapy, ILSI) were added, the proportion discordant EMS use was 29% (range 1–59%).

In EDs with more markers of urgency present, the proportion of discordant EMS use was low, whereas EDs with less markers of urgency present having more discordant EMS (Table 2). ED settings with high self-referral rates to the ED (> 57%) were having more discordant EMS use ( $p < 0.05$ ) (Appendix A). A sensitivity analysis using a random 80% children per ED setting did not show any differences in discordant EMS use (Appendix H).

Children in the younger age groups tended to have more discordant EMS use compared with children 12 < 18 years old. Gender was not associated with EMS use (aOR 1.1, 95% CI 1.0–1.3). The neurological group had less discordant EMS use with an aOR of 0.2 (95% CI 0.1–0.2). ED attendance during OOH was associated with more discordant EMS use (aOR 1.6, 95% CI 1.4–1.9) (Table 3).

### EMS process per country

The EMS process in all participating countries is rather comparable: calling the emergency number by anyone is possible, triage and assessment by phone to decide whether EMS

**Table 1** Patient characteristics and management stratified by EMS use ( $N = 36,156$ )

|                                 | EMS<br><i>N</i> = 5464 (15) | Non-EMS<br><i>N</i> = 30,692 (85) | Missing   |
|---------------------------------|-----------------------------|-----------------------------------|-----------|
| Age (years) <sup>a*</sup>       | 2.4 (1.3–4.9)               | 2.8 (1.3–5.7)                     | /         |
| Gender (male)                   | 3012 (55)                   | 16,845 (55)                       | 1 (0)     |
| Comorbidity*                    | 745 (14)                    | 5167 (17)                         | 343 (0.9) |
| Visiting hours (out of office)* | 4152 (76)                   | 19,912 (65)                       | /         |
| Triage urgency*                 |                             |                                   | /         |
| <i>Low</i>                      | 2427 (44)                   | 20,890 (68)                       |           |
| <i>Intermediate/high</i>        | 3037 (56)                   | 9802 (32)                         |           |
| Ill appearance*                 | 1591 (29)                   | 4050 (13)                         | 1507 (4)  |
| Abnormal vital signs            |                             |                                   |           |
| <i>Tachycardia*</i>             | 1594 (29)                   | 7568 (25)                         | 3134 (9)  |
| <i>Tachypnoea*</i>              | 1095 (20)                   | 4407 (14)                         | 7664 (21) |
| <i>Hypoxia</i>                  | 113 (2)                     | 683 (2)                           | 4436 (12) |
| Presenting symptoms*            |                             |                                   | /         |
| <i>Neurological</i>             | 740 (14)                    | 772 (3)                           |           |
| <i>Respiratory</i>              | 2580 (47)                   | 17,975 (59)                       |           |
| <i>Gastrointestinal</i>         | 829 (15)                    | 4727 (15)                         |           |
| <i>Other</i>                    | 1315 (24)                   | 7218 (24)                         |           |
| Diagnostics*                    | 4000 (73)                   | 18,259 (60)                       | /         |
| <i>Simple*</i>                  | 3861 (71)                   | 17,252 (56)                       |           |
| <i>CRP</i>                      | 3301 (60)                   | 12,444 (41)                       |           |
| <i>WBC count</i>                | 3290 (60)                   | 12,370 (40)                       |           |
| <i>Urine analysis</i>           | 1851 (34)                   | 7113 (23)                         |           |
| <i>Urine culture</i>            | 268 (5)                     | 2446 (8)                          |           |
| <i>Respiratory test</i>         | 919 (17)                    | 5329 (17)                         |           |
| <i>Advanced*</i>                | 1431 (26)                   | 7012 (23)                         |           |
| <i>Imaging</i>                  | 1279 (23)                   | 5326 (17)                         |           |
| <i>Chest X-ray</i>              | 1008 (18)                   | 4158 (14)                         |           |
| <i>Other X-ray</i>              | 111 (2)                     | 327 (1)                           |           |
| <i>Ultrasound</i>               | 229 (4)                     | 1170 (4)                          |           |
| <i>CT</i>                       | 54 (1)                      | 141 (0.5)                         |           |
| <i>MRI</i>                      | 10 (0.2)                    | 71 (0.2)                          |           |
| <i>Blood culture</i>            | 340 (6)                     | 3016 (10)                         |           |
| <i>Lumbar puncture</i>          | 53 (1)                      | 351 (1)                           |           |
| Treatment                       |                             |                                   | /         |
| <i>Oxygen therapy*</i>          | 209 (4)                     | 752 (3)                           |           |
| <i>ILSI*</i>                    | 204 (4)                     | 386 (1)                           |           |
| Hospital admission*             | 1955 (36)                   | 7310 (24)                         |           |
| <i>To ward</i>                  | 1911 (35)                   | 7212 (24)                         |           |
| <i>To PICU</i>                  | 44 (0.8)                    | 98 (0.3)                          |           |
| Focus of infection*             |                             |                                   | 5 (0)     |
| <i>Sepsis/meningitis</i>        | 31 (0.6)                    | 231 (0.8)                         |           |
| <i>Respiratory tract</i>        | 3816 (70)                   | 20,492 (67)                       |           |
| <i>Gastrointestinal tract</i>   | 629 (12)                    | 3163 (10)                         |           |
| <i>Urinary tract</i>            | 197 (4)                     | 1042 (3)                          |           |
| <i>Other</i>                    | 775 (14)                    | 5760 (19)                         |           |
| Cause of infection*             |                             |                                   | 247 (0.7) |
| <i>Presumed bacterial</i>       | 1360 (25)                   | 6580 (21)                         |           |

**Table 1** (continued)

|                             | EMS<br>N = 5464 (15) | Non-EMS<br>N = 30,692 (85) | Missing |
|-----------------------------|----------------------|----------------------------|---------|
| Unknown bacterial/<br>viral | 699 (13)             | 4764 (16)                  |         |
| Presumed viral              | 3159 (58)            | 17,143 (56)                |         |
| Other                       | 234 (4)              | 1970 (6)                   |         |

Absolute numbers and percentages (%) are shown

ILSI immediate life-saving interventions on arrival at the ED, PICU paediatric intensive care unit

\*Significantly differed between the EMS and non-EMS group ( $p$ -value < 0.05)

<sup>a</sup>Median and interquartile range 25–75 are shown

transport is needed, assessment by EMS staff and decision on transport to the ED or stay at home, or advice GP consultation. In Spain, patients can be transported to the GP OOH by EMS as well, and in Greece any child will be transferred to the ED if parents are patient enough to wait. The reasons for EMS use are not only transport for critically ill patients but also lack of private transport and an emergency call during OOH. The full answers on the questionnaire are shown in Appendix D and a diagram of healthcare pathways initiating EMS transport to the ED is shown in Appendix E.

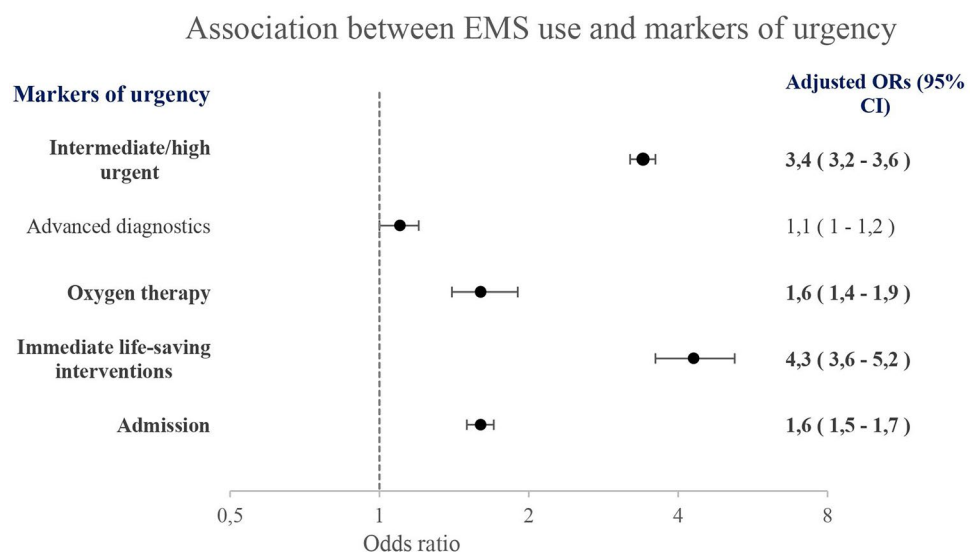
## Discussion

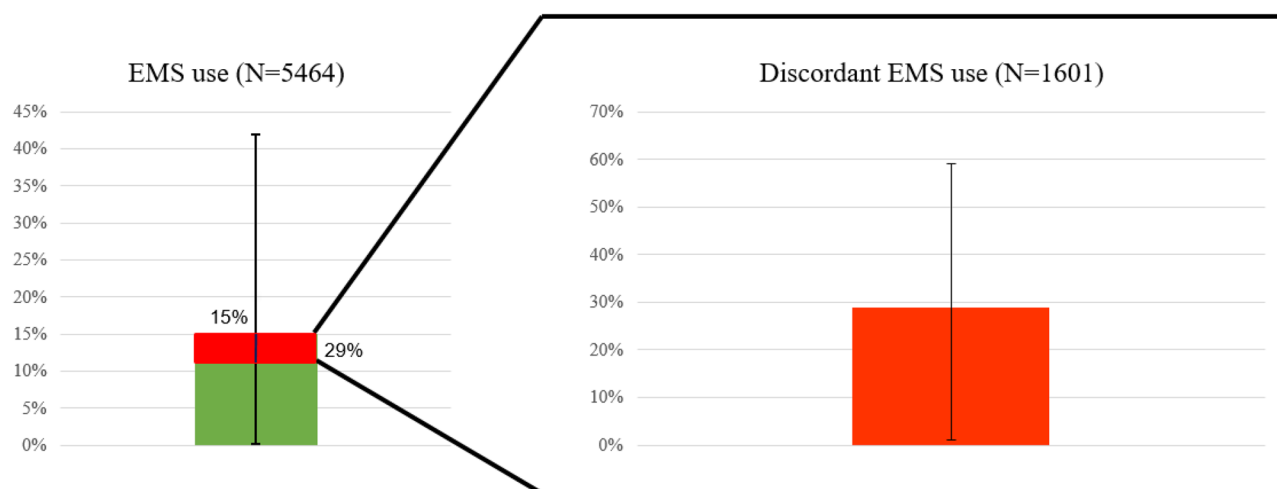
### Main findings

There is large practice variation in EMS use in febrile children across the participating EDs, ranging from 0.1 to 42%. Children arriving by EMS are more often triaged as high urgent and received more extensive management. On one

hand, this could be explained by the fact the children arriving by EMS are more severely ill and therefore receive more diagnostics tests and get admitted more often. On the other hand, physicians may be steered towards a more aggressive workup by the transportation by EMS itself. A previous study on diagnostic variation in febrile children attending European EDs showed that having a high triage urgency level leads to more diagnostic testing and hospitalisation after adjusting for patient and hospital characteristics [25]. In our febrile paediatric population, discordant EMS use occurred in 29% ranging from 1 to 59% assuming differences in patient mix, prehospital pathways, and healthcare systems. We found no clear association between age and gender and discordant EMS use. However, children presenting with neurological symptoms were associated with less discordant EMS use (aOR 0.2, 95% CI 0.1–0.2), which was also reported in a previous study with seizures or altered mental status accounting for the lowest percentage of discordant EMS use, while fever accounted for the highest percentage [15]. By contrast, EMS transport during OOH hours was associated with more discordant EMS use (aOR 1.6, 95% CI 1.4–1.9), possibly reflecting differences in pre-hospital healthcare systems (e.g. availability of GP OOH) and social factors as socioeconomic status [20]. Similarly, settings with high self-referral rates to the ED had more discordant EMS use, assuming referral pathways as important predictor for EMS use. Lastly, our questionnaire showed that the EMS process in the participating countries is quite similar, and therefore we could not use this information for the analysis. This implies that there are other factors accounting for the large range in (discordant) EMS use. However, we did not have information on non-medical factors, e.g. access to healthcare, socioeconomic status, distance from hospital, availability of GP OOH, language barriers, and public transport [14].

**Fig. 1** Association between EMS use and markers of urgency as five separate models with the non-EMS group as reference group. Adjusted for age, gender, visiting hours, presenting symptoms, and ED setting





**Fig. 2** Proportion EMS use (15%,  $N=5464/36,256$ ) and discordant EMS use (29%,  $N=1601/5464$ ) with corresponding ranges across the EDs depicted with error bars

## Strengths and limitations

This is the first study examining the use of EMS and the proportion discordant EMS use in febrile children across eight European countries, and it discusses an important current medical topic. [9, 10] The MOFICHE study involved extensive data collection on patient characteristics, disease severity, and management. A clear definition of discordant EMS use was created based on extensive literature search and input of the research team. The need for a universal definition for dis/concordant EMS use was already mentioned in a recent systematic review from Proctor et al. on factors associated with ambulance use for non-emergency problems in children. They stated that “Both policymakers and academics need to work towards a contextually nuanced and consistent definition of ‘appropriate’ ambulance resource use” [6]. There are several limitations that should be acknowledged as well. Since the MOFICHE study includes data from large

European university hospitals, the results may not be generalisable to smaller general hospitals. We have not taken into account non-medical factors that could influence the choice for transport by EMS and the proportion discordant EMS use, such as long arrival time due to geographical location when living in a rural area or socioeconomic status [26, 27]. Lastly, there might have been misclassification of the EMS group as we had no information on who initiated the EMS pathway. However, a sensitivity analysis in which we simulated that 20% of EMS transports was initiated by GPs showed no change in the proportion discordant EMS use.

## Implications for clinical practice and future research

Practice variation in both EMS use and discordant EMS use across Europe can be attributable to non-medical factors, such as healthcare system-related (e.g. referral systems, availability of resources, OOH emergency provision) and

**Table 2** Heat map of discordant EMS use and markers of urgency per ED

| EMS use<br>( $N=5464$ ) | Discordant EMS use<br>% | Intermediate/high triage<br>urgency<br>% | Advanced diagnostics<br>% | Oxygen therapy<br>% | ILSI<br>% | Admission<br>% |
|-------------------------|-------------------------|------------------------------------------|---------------------------|---------------------|-----------|----------------|
| NL1 ( $N=70$ )          | 1                       | 75                                       | 40                        | 17                  | 33        | 17             |
| NL2 ( $N=171$ )         | 2                       | 95                                       | 30                        | 39                  | 33        | 39             |
| Slovenia ( $N=288$ )    | 8                       | 72                                       | 25                        | 10                  | 1         | 11             |
| NL3 ( $N=16$ )          | 13                      | 75                                       | 25                        | 13                  | 6         | 13             |
| Austria ( $N=63$ )      | 14                      | 62                                       | 16                        | 3                   | 3         | 3              |
| Greece ( $N=6$ )        | 17                      | 83                                       | 17                        | 0                   | 0         | 0              |
| UK3 ( $N=380$ )         | 17                      | 80                                       | 23                        | 7                   | 9         | 7              |
| Spain ( $N=69$ )        | 23                      | 68                                       | 30                        | 3                   | 1         | 3              |
| Latvia ( $N=3740$ )     | 30                      | 53                                       | 28                        | 1                   | 2         | 1              |
| UK1 ( $N=95$ )          | 40                      | 48                                       | 25                        | 11                  | 7         | 11             |
| Germany ( $N=9$ )       | 44                      | 44                                       | 22                        | 11                  | 0         | 11             |
| UK2 ( $N=557$ )         | 59                      | 32                                       | 13                        | 6                   | 3         | 6              |

Percentages per ED are shown. Red shades depict discordant EMS use. Green shades depict markers of urgency

**Table 3** Association between patient characteristics and discordant EMS use

|                          | OR (95% CI)   | aOR (95% CI)  |
|--------------------------|---------------|---------------|
| Age (years) <sup>a</sup> |               |               |
| < 1                      | 1.4 (1.1–1.8) | 1.4 (1.1–1.8) |
| 1 < 5                    | 1.3 (1.0–1.7) | 1.3 (1.0–1.7) |
| 5 < 12                   | 1.4 (1.1–1.9) | 1.5 (1.1–1.9) |
| 12 < 18                  | REF           | REF           |
| Gender                   |               |               |
| Girls                    | 1.1 (1.0–1.2) | 1.1 (1.0–1.3) |
| Boys                     | REF           | REF           |
| Presenting symptoms      |               |               |
| Neurological             | 0.2 (0.1–0.3) | 0.2 (0.1–0.2) |
| Respiratory              | 0.9 (0.8–1.1) | 0.9 (0.7–1.0) |
| Gastrointestinal         | 0.8 (0.6–0.9) | 0.8 (0.6–0.9) |
| Other                    | REF           | REF           |
| Visiting hours           |               |               |
| OOH                      | 1.6 (1.4–1.9) | 1.6 (1.4–0.9) |
| During office hours      | REF           | REF           |

OOH out of office hours

<sup>a</sup>Age distribution per setting is shown in Appendix I

societal factors (e.g. availability of transport, socioeconomic status, parental experiences, distance to hospital). Qualitative research is needed to explore the reasons of parents to call EMS for their febrile child [28]. An eHealth tool is being developed for parents to support them assessing their febrile child's disease severity based on alarm symptoms such as lethargy [29]. Further research is needed on non-medical factors influencing discordant EMS use and refining healthcare pathways might lead to more efficient EMS use. It would be valuable to examine the influence of longer GP's office hours and the availability of OOH GPs with specific experience in paediatrics.

## Conclusion

There is large practice variation in EMS use in febrile children attending European EDs. Markers of urgency were more frequently present in children attending the ED by EMS. However, discordant EMS use occurred in 29%, ranging from 1 to 59% across EDs. Age and gender were not associated with discordant EMS use, whereas neurological symptoms were associated with less discordant EMS use and attendance during OOH was associated with more discordant EMS use. Settings with higher self-referral rates to the ED had more discordant EMS use. Further research is needed to understand non-medical factors influencing discordant EMS use in febrile children across Europe, so that pre-emptive strategies can be implemented.

**Supplementary Information** The online version contains supplementary material available at <https://doi.org/10.1007/s00431-023-05056-3>.

**Authors' contributions** All authors contributed to the conception and design of the MOFICHE study. CT, EC, and HM designed the EMS study and did the interpretation of the findings. CT performed the analyses and wrote the first draft of the manuscript. All authors commented on previous versions of the manuscript, and read and approved the final manuscript.

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**Data availability** Data of this study are available upon request from the corresponding author (edcarrol@liverpool.ac.uk), subject to local rules and regulations.

## Declarations

**Ethics approval** The study was approved by all the participating hospitals: Austria (Ethikkommission Medizinische Universität Graz, ID: 28–518 ex 15/16), Germany (Ethikkommission der LMU München, ID: 699–16), Greece (Ethics committee, ID: 9683/18.07.2016), Latvia (Centrālā medicīnas ētikas komiteja, ID: 14.07.201 6. No. II 16–07 -14), Slovenia (Republic of Slovenia National Medical Ethics Committee, ID: ID: 0120–483/2016–3), Spain (Comité Autonómico de Ética de la Investigación de Galicia, ID: 2016/331), The Netherlands (Commissie Mensgebonden onderzoek, ID: NL58103.091.16), and UK (Ethics Committee, ID: 16/LO/1684, IRAS application no. 209035, Confidentiality advisory group reference: 16/CAG/0136). No informed consent was needed for this study. In all the participating UK settings, an additional opt-out mechanism was in place. This study was performed in accordance with the ethical standards as laid down in the 1964 Helsinki Declaration and its later amendments.

**Competing interests** The authors declare no competing interests.

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