# Cut-off values of MASK-air<sup>®</sup> Patient-Reported Outcome Measures (PROMs)

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# 4 Short-title: Cut-off values in allergic diseases

5 6 Bernardo Sousa-Pinto, PhD<sup>1-3</sup>; Ana Sá-Sousa, PhD<sup>1-3</sup>; Rafael José Vieira, MD<sup>1-3</sup>; Rita Amaral, PhD<sup>1-3</sup>; Ana 7 Margarida Pereira, MD<sup>1-3</sup>; Josep M Anto, MD<sup>4-7</sup>; Ludger Klimek, MD<sup>8</sup>; Wienczyslawa Czarlewski, MD<sup>9</sup>; Joaquim 8 Mullol, MD<sup>10</sup>; Oliver Pfaar, MD<sup>60</sup>; Anna Bedbrook, BSc<sup>11</sup>; Luisa Brussino, MD<sup>12</sup>; Violeta Kvedariene, MD<sup>13</sup>; 9 Desirée E. Larenas-Linnemann, MD<sup>14</sup>; Yoshitaka Okamoto, MD<sup>15</sup>; Maria Teresa Ventura, MD<sup>16</sup>; Ignacio J 10 Ansotegui, MD<sup>17</sup>; Sinthia Bosnic-Anticevich, PhD<sup>18</sup>; G Walter Canonica, MD<sup>19</sup>; Victoria Cardona, MD<sup>20</sup>; Lorenzo Cecchi, MD<sup>21</sup>; Tomas Chivato, MD<sup>22</sup>; Cemal Cingi, MD<sup>23</sup>; Elísio M Costa, PhD<sup>24</sup>; Alvaro A Cruz, MD<sup>25</sup>; Stefano Del 11 12 Giacco, MD<sup>26</sup>; Philippe Devillier, MD<sup>27</sup>; Wytske J Fokkens, MD<sup>28</sup>; Bilun Gemicioglu, MD<sup>29</sup>; Tari Haahtela, MD<sup>30</sup>; Juan Carlos Ivancevich, MD<sup>31</sup>; Piotr Kuna, MD<sup>32</sup>; Igor Kaidashev, MD<sup>33</sup>; Helga Kraxner, MD<sup>34</sup>; Daniel Laune, 13 14 MD<sup>35</sup>; Renaud Louis, MD<sup>36</sup>; Michael Makris, MD<sup>37</sup>; Riccardo Monti, MD<sup>38</sup>; Mario Morais-Almeida, MD<sup>39</sup>; Ralph 15 Mösges, MD<sup>40</sup>; Marek Niedoszytko, MD<sup>41</sup>; Nikolaos G Papadopoulos, MD<sup>42</sup>; Vincenzo Patella, MD<sup>43</sup>; Nhân 16 Pham-Thi, MD<sup>44</sup>; Frederico S Regateiro, MD<sup>45</sup>; Sietze Reitsma, MD<sup>46</sup>; Philip W. Rouadi, MD<sup>47</sup>; Boleslaw 17 Samolinski, MD<sup>48</sup>; Aziz Sheikh, MD<sup>49</sup>; Milan Sova, MD<sup>50</sup>; Luis Taborda-Barata, MD<sup>51</sup>; Sanna Toppila-Salmi, MD<sup>30</sup>; 18 Joaquin Sastre, MD<sup>52</sup>; Ioanna Tsiligianni, MD<sup>53</sup>; Arunas Valiulis, MD<sup>54</sup>; Arzu Yorgancioglu, MD<sup>55</sup>; Mihaela Zidarn,

- 19 MD<sup>56</sup>; Torsten Zuberbier, MD<sup>57,58</sup>; Joao A Fonseca, PhD<sup>1-3</sup>; Jean Bousquet, MD<sup>57,58,59</sup>
- 20 21
- MEDCIDS Department of Community Medicine, Information and Health Decision Sciences; Faculty of Medicine, University of Porto, Porto, Portugal.
- 24 2. CINTESIS Center for Health Technology and Services Research; University of Porto, Porto, Portugal.
- 25 3. RISE Health Research Network; University of Porto, Porto, Portugal.
- 26 4. ISGlobal, Barcelona Institute for Global Health, Barcelona, Spain.
- 27 5. IMIM (Hospital del Mar Medical Research Institute), Barcelona, Spain.
- 28 6. Universitat Pompeu Fabra (UPF), Barcelona, Spain.
- 29 7. CIBER Epidemiología y Salud Pública (CIBERESP), Barcelona, Spain.
- Bepartment of Otolaryngology, Head and Neck Surgery, Universitätsmedizin Mainz, Mainz, and Center for
   Rhinology and Allergology, Wiesbaden, Germany.
- 32 9. Medical Consulting Czarlewski, Levallois & MASK-air, Montpellier, France.

Rhinology Unit & Smell Clinic, ENT Department, Hospital Clínic; Clinical & Experimental Respiratory
 Immunoallergy, IDIBAPS, CIBERES, University of Barcelona, Spain.

- 35 11. ARIA & MASK-air, Montpellier, France.
- 36 12. Department of Medical Sciences, Allergy and Clinical Immunology Unit, University of Torino & Mauriziano
   37 Hospital, Torino, Italy.
- Institute of Biomedical Sciences, Department of Pathology, Faculty of Medicine, Vilnius University and
   Institute of Clinical medicine, Clinic of Chest diseases and Allergology, Faculty of Medicine, Vilnius
   University, Vilnius, Lithuania.
- 41 14. Center of Excellence in Asthma and Allergy, Médica Sur Clinical Foundation and Hospital, México City,
   42 Mexico.
- 43 15. Dept of Otorhinolaryngology, Chiba University Hospital, Chiba, and Chiba Rosai Hospital, Chiba, Japan.
- 44 16. Unit of Geriatric Immunoallergology, University of Bari Medical School, Bari, Italy.
- 45 17. Department of Allergy and Immunology, Hospital Quironsalud Bizkaia, Bilbao, Spain.
- 46 18. Quality Use of Respiratory Medicine Group, Woolcock Institute of Medical Research, The University of
   47 Sydney, and Sydney Local Health District, Sydney, NSW, Australia.

- 48 19. Department of Biomedical Sciences, Humanitas University, Pieve Emanuele, Milan, and Personalized
   49 Medicine, Asthma and Allergy, Humanitas Clinical and Research Center IRCCS, Rozzano, Italy.
- Allergy Section, Department of Internal Medicine, Hospital Vall d'Hebron & ARADyAL research network,
   Barcelona, Spain.
- 52 21. SOS Allergology and Clinical Immunology, USL Toscana Centro, Prato, Italy.
- 53 22. School of Medicine, University CEU San Pablo, Madrid, Spain.
- 54 23. Eskisehir Osmangazi University, Medical Faculty, ENT Department, Eskisehir, Turkey.
- 55 24. UCIBIO, REQUINTE, Faculty of Pharmacy and Competence Center on Active and Healthy Ageing of
   56 University of Porto (Porto4Ageing), Porto, Portugal
- 57 25. Fundaçao ProAR, Federal University of Bahia and GARD/WHO Planning Group, Salvador, Bahia, Brazil.
- 58 26. Department of Medical Sciences and Public Health and Unit of Allergy and Clinical Immunology, University
   59 Hospital "Duilio Casula", University of Cagliari, Cagliari, Italy.
- VIM Suresnes, UMR 0892, Pôle des Maladies des Voies Respiratoires, Hôpital Foch, Université Paris Saclay, Suresnes, France.
- 62 28. Department of Otorhinolaryngology, Amsterdam University Medical Centres, location AMC, Amsterdam,63 the Netherlands.
- 64 29. Department of Pulmonary Diseases, Istanbul University-Cerrahpasa, Cerrahpasa Faculty of Medicine,
   65 Istanbul, Turkey.

66 30. Skin and Allergy Hospital, Helsinki University Hospital, University of Helsinki, Helsinki, Finland.

- 67 31. Servicio de Alergia e Immunologia, Clinica Santa Isabel, Buenos Aires, Argentina.
- 68 32. Division of Internal Medicine, Asthma and Allergy, Barlicki University Hospital, Medical University of Lodz,
   69 Poland.
- 70 33. Poltava State Medical University, Ukraine.
- 71 34. Department of Otorhinolaryngology, Head and Neck Surgery, Semmelweis University, Budapest, Hungary.
- 72 35. KYomed INNOV, Montpellier, France.
- 73 36. Department of Pulmonary Medicine, CHU Liege, and GIGA I3 research group, University of Liege, Belgium.
- Allergy Unit "D Kalogeromitros", 2nd Dpt of Dermatology and Venereology, National & Kapodistrian
   University of Athens, "Attikon" University Hospital, Greece.
- 76 38. Department of Cardiovascular and Thoracic Sciences, Fondazione Policlinico Universitario A Gemelli
   77 IRCCS, Università Cattolica del Sacro Cuore, Rome, Italy.
- 78 39. Allergy Center, CUF Descobertas Hospital, Lisbon, Portugal
- 40. IMSB, Medical Faculty, University at Cologne, and ClinCompetence Cologne GmbH, Cologne, Germany
- 80 41. Department of Allergology, Medical University of Gdańsk, Gdansk, Poland.
- 81 42. Allergy Department, 2nd Pediatric Clinic, University of Athens, Athens, Greece.
- B2 43. Division of Allergy and Clinical Immunology, Department of Medicine, Agency of Health ASL Salerno,
   B3 "Santa Maria della Speranza" Hospital, Battipaglia, Salerno, Italy.
- 84 44. Ecole Polytechnique Palaiseau, IRBA (Institut de Recherche bio-Médicale des Armées), Bretigny, France.
- Allergy and Clinical Immunology Unit, Centro Hospitalar e Universitário de Coimbra, Coimbra and Institute
   of Immunology, Faculty of Medicine, University of Coimbra, Coimbra & ICBR Coimbra Institute for
   Clinical and Biomedical Research, CIBB, Faculty of Medicine, University of Coimbra, Coimbra, Portugal.
- 88 46. Department of Otorhinolaryngology, Amsterdam University Medical Centres, AMC, Amsterdam, the89 Netherlands.
- 90 47. Department of Otolaryngology-Head and Neck Surgery, Eye and Ear University Hospital, Beirut, Lebanon &
   91 Department of Otolaryngology-Head and Neck Surgery, Dar Al Shifa Hospital, Salmiya, Kuwait.
- 92 48. Department of Prevention of Environmental Hazards, Allergology and Immunology, Medical University of
   93 Warsaw, Poland.
- 94 49. Usher Institute, The University of Edinburgh, Edinburgh, UK.
- 95 50. Department of Respiratory Medicine and Tuberculosis, University Hospital, Brno, Czech Republic.
- 96 51. UBIAir Clinical & Experimental Lung Centre, University of Beira Interior, Covilhã and CICS-Health Sciences
   97 Research Centre, University of Beira Interior, Covilhã and Department of Immunoallergology, Cova da
   98 Beira University Hospital Centre, Covilhã, Portugal.
- 99 52. Fundacion Jimenez Diaz, CIBERES, Faculty of Medicine, Autonoma University of Madrid, Madrid, Spain.
- Health Planning Unit, Department of Social Medicine, Faculty of Medicine, University of Crete, Greece
   and International Primary Care Respiratory Group IPCRG, Edinburgh, UK.
- 102 54. Institute of Clinical Medicine and Institute of Health Sciences, Vilnius, and Medical Faculty of Vilnius
   103 University, Vilnius, Lithuania.
- 104 55. Department of Pulmonary Diseases, Celal Bayar University, Faculty of Medicine, Manisa, Turkey.

- 105 56. University Clinic of Respiratory and Allergic Diseases, Golnik & University of Ljubljana, Faculty of Medicine, 106 Ljubljana, Slovenia.
- 107 57. Institute of Allergology, Charité – Universitätsmedizin Berlin, Corporate Member of Freie Universität 108 Berlin and Humboldt-Universität zu Berlin, Berlin, Germany
- 109 58. Fraunhofer Institute for Translational Medicine and Pharmacology ITMP, Allergology and Immunology, 110 Berlin, Germany
- 111 59. University Hospital Montpellier, France.
- 112 60. Department of Otorhinolaryngology, Head and Neck Surgery, Section of Rhinology and Allergy, University 113 Hospital Marburg, Philipps-Universität Marburg, Marburg, Germany.
- 114
- 115
- 116 117
- 118
- 119 **Correspondence to:** Professor Jean Bousquet, Institute of Allergology, Charité – 120 Universitätsmedizin Berlin, Corporate Member of Freie Universität Berlin and Humboldt-Universität 121 zu Berlin, Berlin, Germany; Telephone: +33 611 42 88 47; Mail: jean.bousquet@orange.fr
- 122

#### **Conflicts of Interest:** 123

- 124
- 125 Dr. Ansotegui reports personal fees from Roxall, personal fees from UCB, personal fees from Faes Farma, 126 personal fees from Sanofi, personal fees from Bial, personal fees from Abbott, personal fees from Bayer,
- 127 personal fees from Organon, outside the submitted work.
- 128 Dr. Bosnic-Anticevich reports grants from TEVA, personal fees from TEVA, personal fees from TEVA, personal
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- 136 Dr. Cardona reports personal fees from ALK, personal fees from Allergopharma, personal fees from GSK, grants 137 from Thermofisher, outside the submitted work.
- 138 Dr. Cecchi reports personal fees from Thermofisher, personal fees from Astra Zeneca, personal fees from
- 139 Sanofi, personal fees from Novartis, outside the submitted work.
- 140 Dr. Cruz reports personal fees from AstraZeneca, personal fees from Boehringer-Ingelheim, personal fees from
- 141 Chiesi, personal fees from GSK, personal fees from Novartis, personal fees from Sanofi, personal fees from 142 Eurofarma, outside the submitted work.
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- Dr. Kuna reports personal fees from Adamed, personal fees from Berlin Chemie Menarini, personal fees from 156 Boehringer Ingelheim, personal fees from AstraZeneca, personal fees from Glenmark, personal fees from Krka,

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**Dr. Kvedariene** reports other from Norameda, other from BerlinChemie Menarini, outside the submitted work.

160 **Dr. Larenas Linnemann** reports personal fees from ALK, Allakos, Amstrong, Astrazeneca national and global,

161 Chiesi, DBV Technologies, Grunenthal, GSK national and global, Mylan/Viatris, Menarini, MSD, Novartis, Pfizer,

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 UCB, GSK, Purina institute., outside the submitted work.

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personal fees from ASTRA ZENECA, personal fees from SANOFI, personal fees from PFIZER, personal fees fromCHIESI, outside the submitted work.

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personal fees from Sidroga, grants and personal fees from HAL BV, personal fees from Lek, personal fees from
 PRO-AdWise, outside the submitted work.

182 Dr. Okamoto reports personal fees from Torii Co., Ltd., personal fees from ALK, personal fees from Kirin

Pharmaceutical Co., Ltd., personal fees from Tanabe-Mitsubishi Pharmaceutical Company, outside thesubmitted work.

**Dr. Papadopoulos** reports personal fees from Novartis, personal fees from Nutricia, personal fees from HAL,

personal fees from MENARINI/FAES FARMA, personal fees from SANOFI/REGENERON, personal fees from
 MYLAN/MEDA, personal fees from BIOMAY, personal fees from AstraZeneca, personal fees from GSK, personal
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191 Dr. Pfaar reports grants and personal fees from ALK-Abelló, grants and personal fees from Allergopharma,

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Biotech Tools S.A., grants and personal fees from Laboratorios LETI/LETI Pharma, personal fees from MEDA
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197 GA2LEN Partner), personal fees from Indoor Biotechnologies, grants and personal fees from GlaxoSmithKline,

personal fees from Astellas Pharma Global, personal fees from EUFOREA, personal fees from ROXALL Medizin,
 personal fees from Novartis, personal fees from Sanofi-Aventis and Sanofi-Genzyme, personal fees from Med

200 Update Europe GmbH, personal fees from streamedup! GmbH, grants from Pohl-Boskamp, grants from

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work; and member of EAACI Excom, member of ext. board of directors DGAKI; coordinator, main- or co-

author of different position papers and guidelines in rhinology, allergology and allergen-immunotherapy.
 Dr. Regateiro reports personal fees from Novartis, personal fees from Sanofi, personal fees from AstraZeneca,

209 personal fees from GSK, personal fees from Medinfar, personal fees from Azentis, outside the submitted work.

Dr. Samoliński reports personal fees from Polpharma, personal fees from Viatris, grants and personal fees from

AstraZeneca, personal fees from TEVA, personal fees from patient ombudsman, personal fees from Polish

Allergology Society, grants from GSK, outside the submitted work.

- 213 Dr. Sastre reports grants and personal fees from SANOFI, personal fees from GSK, personal fees from
- NOVARTIS, personal fees from FAES FARMA, personal fees from ABBVIE, outside the submitted work; and
   AAAAI: no payment; EAACI: no payment; SEAIC: no payment.
- 216 Dr. Toppila-Salmi reports grants from GSK, personal fees from AstraZeneca, personal fees from ALK Abello,
- personal fees from Roche, personal fees from Novartis, personal fees from Sanofi Pharma, outside thesubmitted work.
- Dr. Tsiligianni reports grants from GSK Hellas, Astra Zeneca Hellas, Boehringer Ingelheim, personal fees from
   Boehringer Ingelheim, Astra Zeneca, Chiesi, Novartis, outside the submitted work.
- 221 Dr. Zuberbier reports grants and personal fees from Novartis, grants and personal fees from Henkel, personal
- fees from Bayer, personal fees from FAES, personal fees from Astra Zeneca, personal fees from AbbVie,
- 223 personal fees from ALK, personal fees from Almirall, personal fees from Astellas, personal fees from Bayer,
- 224 personal fees from Bencard, personal fees from Berlin Chemie, personal fees from FAES, personal fees from
- Hal, personal fees from Leti, personal fees from Mesa, personal fees from Menarini, personal fees from Merck,
- 226 personal fees from MSD, personal fees from Novartis, personal fees from Pfizer, personal fees from Sanofi,
- 227 personal fees from Stallergenes, personal fees from Takeda, personal fees from Teva, personal fees from UCB,
- 228 personal fees from Henkel, personal fees from Kryolan, personal fees from L'Oreal, outside the submitted
- work; and Organizational affiliations: Commitee member: WHO-Initiative "Allergic Rhinitis and Its Impact on
- Asthma" (ARIA); Member of the Board: German Society for Allergy and Clinical Immunology (DGAKI); Head:
- 231 European Centre for Allergy Research Foundation (ECARF); President: Global Allergy and Asthma European
- Network (GA2LEN); Member: Committee on Allergy Diagnosis and Molecular Allergology, World Allergy
- 233 Organization (WAO).234
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#### 237 Abstract

Background: In clinical and epidemiological studies, cut-offs of Patient-Reported Outcome
Measures (PROMs) can be used to classify patients into groups of statistical and clinical relevance.
However, visual analog scale (VAS) cut-offs in MASK-air<sup>®</sup> have not been tested.

**Objective:** To calculate cut-offs for VAS global, nasal, ocular, and asthma symptoms.

Methods: In a cross-sectional study design of all MASK-air<sup>®</sup> participants, we compared (i) approaches based on the percentiles (tertiles or quartiles) of VAS distributions, and (ii) data-driven approaches based on clusters of data from two comparators (VAS work and VAS sleep). We then performed sensitivity analyses for individual countries and for VAS levels corresponding to full allergy control. Finally, we tested the different approaches using MASK-air<sup>®</sup> real-world crosssectional and longitudinal data to assess the most relevant cut-offs.

**Results:** We assessed 395,223 days from 23,201 MASK-air<sup>®</sup> users with self-reported allergic rhinitis. The percentile-oriented approach resulted in lower cut-off values than the data-driven approach. We obtained consistent results in the data-driven approach. Following the latter, the proposed cut-off differentiating "controlled" and "partly-controlled" patients was similar to the cutoff value which had been arbitrarily used (20/100). However, a lower cut-off was obtained to differentiate between "partly-controlled" and "uncontrolled" patients (35 *versus* the arbitrarily-used value of 50/100).

255 Conclusion: Using a data-driven approach, we were able to define cut-off values for MASK-air<sup>®</sup>
256 VASs on allergy and asthma symptoms. This may allow for a better classification of rhinitis and
257 asthma patients according to different levels of control, supporting improved disease management.

258

## 259 Highlights

What is already known about this topic? Visual analog scales are patient-reported outcome
measures which have been widely used to monitor allergic rhinitis and asthma control. Their
validity and reliability have been assessed.

What does this article add to our knowledge? Using a data-driven approach, this study identifiedcut-offs for visual analog scales assessing allergic rhinitis and asthma control.

- How does this study impact current management guidelines? The identified cut-offs allow for an
  improved classification of rhinitis and asthma patients according to different levels of control,
  supporting a better disease management.
- 268
- 269 Key words: rhinitis, asthma, conjunctivitis, cut-offs, MASK-air
- 270

## 271 Abbreviations

- 272 AUC-ROC: Area under the receiver operating characteristic
- 273 CARAT; Control of Allergic Rhinitis and Asthma Test
- 274 GDPR: General Data Protection Regulation
- 275 INAH: Intranasal antihistamines
- 276 ICS: Inhaled steroids
- 277 INCS: Intranasal steroids
- 278 LABA: Long-acting beta-agonists
- 279 LAMA: Long-acting muscarinic antagonists
- 280 MDR: Medical Device Regulation
- 281 OAH: Oral antihistamines
- 282 PROMs: Patient-reported outcome measures
- 283 SABA: Short-acting beta-agonists
- 284 VAS: Visual analog scales
- 285 WHO: World Health Organization

### 286 Introduction

287 Portable devices, such as smartphones and mobile Internet access, have become ubiquitous in the last decades, and their application to rhinitis and asthma widespread.<sup>1</sup> However, few apps have been 288 289 validated.<sup>2</sup> The MASK-air<sup>®</sup> (Mobile Airways Sentinel NetworK for airway diseases) app is a Good Practice of DG Santé for digitally-enabled, patient-centered care in rhinitis and asthma 290 291 multimorbidity.<sup>3-5</sup> It can be downloaded freely from the Google Play and Apple App Stores in 27 292 countries (www.mask-air.com). In MASK-air®, patients report their daily symptoms through visual 293 analog scales (VASs) for overall, nasal, ocular, and asthma symptoms (Table E1). These VASs 294 therefore represent patient-reported outcome measures (PROMs)<sup>6</sup> and may be understood as digital 295 biomarkers.

296 In clinical and epidemiological studies, PROMs can be used to classify patients into groups of 297 statistical and clinical relevance. Patient classification into groups based on the value of a PROM 298 (cut-off) may help in the decision to provide different care or procedures. The MASK-air<sup>®</sup> cut-offs 299 for the different MASK-air<sup>®</sup> VASs have been arbitrarily defined according to (i) the World Health 300 Organization (WHO) definition of cut-offs for the International Classification of Functioning, 301 Disability and Health ICF grading<sup>7</sup>, and (ii) the results of a large study assessing VAS cut-offs in ARIA (Allergic Rhinitis and its Impact on Asthma) classes.<sup>8</sup> Four classes of control and the 302 303 respective cut-offs have been defined for all four symptom VASs: 0/100 (full control), 1-19/100 304 (good control), 20-49/100 (partial control) and  $\geq$ 50/100 (poor control). However, cut-off values 305 should be validated, and there may be differences in cut-offs between VASs.

306 There are two statistical approaches for determining a cut-off value: percentile-oriented (i.e., 307 "PROM distribution-oriented") and outcome-oriented. The percentile-oriented approach splits a 308 continuous marker according to percentiles of data distribution or to the arithmetic or geometric 309 means of PROM values. In contrast, the outcome-oriented approach selects the PROM cut-off that 310 considers the association between outcome and PROM. The outcome-oriented approach is expected to provide a better cut-off value than the percentile-oriented approach,<sup>9</sup> but requires a gold-standard 311 312 outcome measure. In the absence of such an outcome, analogous data-driven approaches can be 313 used.

In this study, we aimed: (i) To calculate cut-offs for VAS global, nasal, ocular, and asthma symptoms in order to propose a better discriminative value for cut-off points. We compared datadriven<sup>10,11</sup> and percentile-oriented approaches in a cross-sectional study design. (ii) To perform sensitivity analyses for individual countries and for VAS levels corresponding to full allergy control. (iii) To test the different approaches using MASK-air<sup>®</sup> real-world data in order to assess the most relevant cut-offs.

#### 320 Methods

#### 321 1- Study design

We assessed different approaches for the estimation of cut-offs for MASK-air<sup>®</sup> symptom VASs. We first followed the percentile-oriented approach based on the percentiles (tertiles or quartiles) of VAS distributions. We then followed a machine learning data-driven approach based on clusters of data from two comparators (comparator VASs: VAS work and VAS sleep). We performed sensitivity analyses for individual countries and for different symptom VAS levels corresponding to full allergy control, and tested the obtained cut-offs according to data on medication use and seasonality.

#### 328 2- Setting and participants

MASK-air<sup>®</sup> has been launched in 27 countries (www.mask-air-com). It has been freely available in the
Google Play and Apple App Stores since 2015.

In this study, we included data from MASK-air<sup>®</sup> users from May 21, 2015 to December 2021. The users (i) had a self-reported diagnosis of allergic rhinitis, and (ii) were ranging in age from 16 to 90 years (or lower than 16 years in countries with a lower age of digital consent).<sup>12</sup> For the identification of VAS asthma cut-offs, we considered only participants with self-reported asthma.

#### 335 3- Ethics

336 MASK-air® is CE1 and Medical Device Regulation (MDR) class IIa registered. It follows the European Union General Data Protection Regulation (GDPR) for privacy.<sup>13</sup> An independent review 337 338 board approval was not required for this specific study as all data were anonymized prior to the study 339 using k-anonymity (transformation of data to hamper the determination of the identity of the individuals in a dataset; <sup>14</sup> for a description of the application of such methods to MASK-air® 340 geolocation data using the GDPR, please check Samreth et al.)<sup>15</sup>, and users agreed to the analysis of 341 342 their data in the terms of use (translated into all languages and customized according to the legislation 343 of each country, allowing the use of the results for research purposes).

#### 344 4- Data sources and variables

MASK-air<sup>®</sup> comprises mandatory daily monitoring questions whose responses are provided by means of four symptom VASs on overall, nasal, ocular, and asthma symptoms (Table E1).<sup>16</sup> VASs are reported on a 0 to 100 scale (with higher values indicating worse symptoms). In addition, the daily monitoring questionnaire comprises two VASs (comparator VASs) assessing the impact of allergic symptoms on sleep and on work (if users report to be working on that day). Then, users are asked to 350 provide their daily medication using a regularly updated scroll list customized for each country and 351 including all over-the-counter and prescribed rhinitis and asthma medications.

#### 352 **5- Data analysis**

When responding to the MASK-air<sup>®</sup> daily monitoring questionnaire, it is not possible to skip any of the questions. This precludes missing data.

Categorical variables were described using absolute and relative frequencies, while continuous
variables were described using means and standard-deviations or medians and interquartile ranges. All
analyses were performed using software R (version 4.0).

#### 358 a. Estimation of cut-off points: percentile-oriented approach

After excluding days of VAS=0 (considered to correspond to full allergy control), we estimated the tertiles and quartiles of VAS global, VAS nose, VAS eye, and VAS asthma (which were used as potential cut-offs in scenarios generating three and four groups beyond "full allergy control"). The distributions of MASK-air<sup>®</sup> VASs are skewed (Figure E1), rendering the estimation of cut-offs based on percentiles appropriate.

364 b. Estimation of cut-off points: data-driven approach

365 In the absence of a single categorical variable (i) indicating daily allergy control, and (ii) independent of assessed VASs, we applied k-means cluster approaches<sup>17-19</sup> to create a categorical 366 "outcome variable" based on VAS work and VAS sleep (as work and sleep are two domains 367 affected by allergy symptoms).<sup>20-25</sup> In particular, for each assessed symptom VAS, and after 368 369 excluding days of VAS=0 ("full allergy control"), we applied k-means approaches so that we 370 obtained three and four clusters. We subsequently determined the symptom VAS cut-off points that 371 best distinguished three or four levels of allergy control (beyond "full allergy control"), maximizing 372 the Youden index (compromise between sensitivity and specificity).

373 c. Sensitivity analyses

For each symptom VAS, we estimated cut-offs using either the percentile- or the machine learning data-driven approaches by (i) not considering full allergy control (and, thus, considering all available data), (ii) excluding observations with VAS<2 as corresponding to full allergy control, and (iii) excluding observations with VAS<3 as corresponding to full allergy control.

We also performed sensitivity analyses by estimating cut-off points for each country with more than1,000 observations, assessing whether there are countries with outlier cut-offs. We used the following

definition for considering outliers: (i) low outlier: Quartile 1 - 1.5 × interquartile range, and (ii) high
outlier: Quartile 3 + 1.5 × interquartile range.

We performed cross-sectional analyses of MASK-air® data, obtaining reported median VAS global, 382 383 VAS nose, and VAS eye for different rhinitis medication schemes by day of MASK-air® use (oral or 384 intranasal antihistamines (OAH or INAH); intranasal corticosteroids (INCS); INCS+INAH; 385 INCS+INAH + other rhinitis medication; INCS+OAH; INCS+OAH + other rhinitis medication; no 386 medication). Similar analyses were performed for VAS asthma, but the considered medication 387 schemes included inhaled steroids (ICS), long-acting beta-agonists (LABA, with or without inhaled 388 steroids), short-acting beta-agonists (SABA), long-acting muscarinic antagonists (LAMA) or biologics 389 and other asthma drugs (including leukotriene receptor antagonists, mast cell stabilizers and 390 xanthines). In addition to these cross-sectional analyses (where median values from all patients reporting each medication scheme were calculated for each day of MASK-air<sup>®</sup> use), longitudinal 391 analyses were also performed, namely in patients who reported MASK-air<sup>®</sup> data on the first fifteen 392 393 days after the first use, reporting at least fourteen days on the same medication scheme.

#### 394 **Results**

#### 395 1- Demographic characteristics

We assessed 395,223 days from 23,201 MASK-air<sup>®</sup> users with self-reported allergic rhinitis (Figure E2). More than half of the days (55.6%) were from females, and the mean participants' age was of 38.0 years (Table 1; Table E2). For the estimation of cut-offs based on the percentile approach, we included all days/observations, while for the estimation of cut-offs based on the machine learning data-driven approach, we only included days/observations for which information was provided simultaneously for VAS work and VAS sleep (*N* days=77,217; *N* users=7019).

#### 402 2- Evaluation of cut-offs

403 Cut-offs obtained with percentile-based and data-driven approaches are displayed in Table 2. The 404 percentile-based approach resulted in overall lower cut-off values than those obtained in the data-405 driven approach. In the data-driven approach, the estimation of four levels of allergy control (beyond 406 full control) often resulted in cut-off points that were very close to each other. Therefore, we proposed 407 cut-offs identifying three levels of control beyond full control (Table 3; Figure E3), namely those 408 estimated by the data-driven approach (as they were obtained based on variables estimating the impact 409 of allergy symptoms). Given the similarities of the cut-off points obtained with the data-driven 410 approach for the different VASs, we suggest - for simplicity purposes - the use of the cut-off points 20 411 and 35 for all assessed VASs. Four groups were identified: full control (VAS=0), good control (VAS

412 1-20), partial control (VAS: 21-35), and poor control (VAS>35). Of note, the groups in which each
413 cut-off point was included reflect the cut-offs obtained for the VAS global allergy symptoms, as the
414 latter is the most comprehensive of all symptom VASs.

#### 415 **3- Sensitivity analyses**

416 Results of the sensitivity analyses estimating the VAS cut-offs based on different assumptions of 417 full allergy control are displayed in Table E3. Lower cut-off points were obtained in the percentile-418 based approach when there was no exclusion of VAS values indicating full allergy control. For the 419 remaining analyses, similar cut-off estimates were obtained.

- 420 Results of the sensitivity analyses estimating VAS cut-offs for individual countries are displayed in
- 421 Tables E4 and E5. For most countries, consistent results were found. There were no outlier countries
- 422 but there were some divergent ones.

#### 423 4- Application of cut-offs to real-world MASK-air<sup>®</sup> data

We assessed obtained cut-offs in real-world MASK-air® data. Examples of results of the cross-424 425 sectional analysis are displayed in Figure 1, while examples of results for longitudinal analyses are 426 provided in Figure 2 (results for all VASs are available upon contact to the authors). For all 427 medication classes, both in cross-sectional and longitudinal analyses, we observed that the highest 428 reported VAS values were those registered on the first day of MASK-air<sup>®</sup> reporting. Among those 429 first day median VAS values, 19% indicated poor control when considering the arbitrary cut-offs 430 versus 52% when considering the machine learning data-driven cut-offs. After the first days, a 431 plateau in VAS values was reached for most medication classes (in 69% of cases, all median values 432 during the plateau stage fell within the "good control" group). With the arbitrary cut-off points, 433 there were seven cases in which the classification of the first day of MASK-air<sup>®</sup> reporting and at 434 least some of the days of the plateau stage were in the same group. With the proposed data-driven 435 cut-offs, this occurred in only six cases. Therefore, by comparison with the arbitrary cut-offs, the 436 proposed cut-off points allowed a better discrimination between median VASs of days under 437 different medication schemes according to the day of MASK-air<sup>®</sup> reporting.

In a more detailed perspective, in the cross-sectional analysis of rhinitis/VAS global allergy symptoms (Figure 1A), day 1 would not have been detected as uncontrolled for no treatment, INCS, and INCS+OAH. Uncontrolled days following day 1 were detected for OAH or INAH (1 day), INCS+OAH (1 day), INCS+INAH+other (3 days), and INCS+OAH+other (2 days) only with the datadriven cut-offs. For VAS asthma (Figure 1B), in SABA reporting, 14/15 days had a cut-off of over 36/100 whereas only one day had uncontrolled days using the arbitrary cut-offs. For LAMA or biologics (probably the most severe group), 14/15 days were uncontrolled using the data-driven cut-offs versus 0/15 using the arbitrary cut-offs.

#### 446 **Discussion**

This study is of great importance since it allowed the identification of cut-off values for MASK-air<sup>®</sup> PROMs for rhinitis, conjunctivitis or asthma. The percentile-based approach resulted in lower cut-off values than those which had been arbitrarily used (20 and 50) as well as than those which had been identified in previous studies using paper-based VASs (4 out of 10 and 7 out of 10).<sup>27</sup> However, we considered the machine learning data-driven values. The proposed cut-off differentiating "controlled" and "partly-controlled" patients was similar to the cut-off value which had been arbitrarily used (20). However, a lower cut-off was obtained to differentiate between "partly-controlled" and "uncontrolled"

454 patients (35 *versus* the arbitrarily used value of 50).

455 This paper has some limitations. The obtained cut-offs reflect the patterns of rhinitis severity of MASK-air® users, particularly the cut-offs related to the percentile-based approach. Therefore, it is 456 457 expectable that different cut-off values might have been observed if, overall, MASK-air<sup>®</sup> users 458 displayed more or less severe rhinitis. This limits the direct generalization of the results of this study 459 beyond MASK-air<sup>®</sup>. In spite of that, the approach followed in this study can be a methodological 460 example (i) for the determination of cut-offs in other PROMs from any chronic disease, particularly in 461 the context of mHealth, where the number of consistently provided relevant variables is often scarce 462 and missing observations are frequent, and (ii) for other mHealth apps once they provide enough data.

463 Moreover, there may be a selection bias, with the potential overrepresentation of younger patients and 464 patients more concerned about their health among MASK-air® users. Nevertheless, reported symptoms and medication use patterns may not be too dissimilar to those of the general population with 465 rhinitis.<sup>28</sup> However, data for asthma are lacking. The possibility of selection biases does not solely 466 467 concern the characteristics of the patients who are more prone to using the MASK-air<sup>®</sup> app, but also 468 the characteristics of the days that tend to be more often reported (i.e., it is expected that patients 469 systematically tend to use MASK-air<sup>®</sup> more often when they are feeling worse). In fact, we observed 470 that a relatively large number of patients provided a small number of observations. In addition to that 471 limitation, we had a smaller sample when considering days reporting only VAS work and VAS sleep. 472 The lower number of days with VAS work data stems from the fact that (i) not all MASK-air® users 473 are employed, and (ii) employed patients do not work every day. On the other hand, VAS sleep was 474 added to MASK-air<sup>®</sup> later than the remaining VASs. Finally, we did not assess hospitalizations or 475 emergency visits since (i) allergic rhinitis does not prompt emergency care visits or hospitalizations, 476 and (ii) these events are relatively rare in asthma in Europe. Systemic steroid use was also rare, with 477 less than 100 observations in our dataset. Thus, the obtention of cut-offs according to the data-driven

478 approach was not based on any healthcare-related use outcome variable, but rather on two variables479 associated with the impact of rhinitis or asthma symptoms (VAS work and sleep).

This study also has important strengths: (i) the fact that the MASK-air<sup>®</sup> VASs have been studied on their validity, reliability, and responsiveness, (ii) the large number of patients assessed, (iii) the robustness of the obtained results in the performed sensitivity analyses (e.g., when estimating cut-off points by country), and (iv) the relatively simple selection of clustered variables given that we used two variables quantifying the impact of daily allergy symptoms in relevant domains of patients' lives (namely work productivity and sleep). This favors the use of cut-offs obtained following the machinelearning data-driven approach.

Converting a continuous variable into a categorical variable has some disadvantages from a statistical 487 488 point of view, including loss of information and potential separation of patients (not too dissimilar) 489 into different categories (namely those with values close to the cut-off points). However, from a 490 clinical point of view, the adoption of cut-offs and the classification of patients into several categories 491 is particularly helpful, supporting the clinical decision process and the patients' disease self-492 management. In fact, the definition of cut-offs for MASK-air® VASs will assist clinicians in having a 493 good distinction between partly-controlled and uncontrolled patients which is important for clinical 494 practice. That is, these cut-off values could facilitate the identification of patients who are most in 495 need of improving their rhinitis and/or asthma control. MASK-air® VAS cut-off values can be applied 496 in the clinical practice alongside the minimal important difference established for such VASs.<sup>29</sup> 497 Therefore, clinicians may not only assess patients' level of control, but also whether during certain 498 periods of time there were clinically important changes in reported symptoms.

When applying the different cut-offs to real-world data, we observed that the highest median symptom VAS values concerned the first day of MASK-air<sup>®</sup> reporting. This may have several possible explanations: (i) the fact that patients may tend to start using the MASK-air<sup>®</sup> app on days when they are not feeling particularly well due to their allergy symptoms, (ii) an improved allergy control associated with the use of medication (as observed in the longitudinal analyses), and/or (iii) an improved allergy control associated with the use of MASK-air<sup>®</sup> (e.g., app use prompting higher medication adherence).

506 Future studies should assess the performance of the proposed VAS classification into four groups in 507 comparison with other asthma and rhinitis PROMs and their cut-offs. In particular, it may be of 508 particular relevance to perform comparisons with other validated allergic rhinitis and asthma 509 questionnaires, such as the Control of Allergic Rhinitis and Asthma Test (CARAT)<sup>30</sup> which is 510 available in MASK-air<sup>®</sup>. In addition, future studies may assess whether the adoption of these cut-off 511 points may result in a better allergy self-management in MASK-air<sup>®</sup> users. In fact, for each day,

- 512 MASK-air<sup>®</sup> indicates whether the patient's symptoms are well-controlled or not. Changing from the
- arbitrarily defined cut-offs to those stricter ones identified in this study may lead MASK-air<sup>®</sup> users to
- 514 further improve their symptoms. Such a hypothesis should be tested in a subsequent study.
- 515 In conclusion, in this study, we proposed cut-off values for MASK-air® VASs on allergy and asthma
- 516 symptoms, following different approaches and testing their robustness in sensitivity analyses. This
- 517 may allow for the classification of rhinitis and asthma patients according to different levels of control,
- 518 supporting a better disease management.
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- 522 Data availability statement: Data can be made available upon reasonable request to the523 corresponding author.
- Author contributions: BSP participated in methodology, formal analysis and writing original
   manuscript; JB participated in conceptualization, formal analysis, supervision and writing original
   manuscript. All remaining authors participated in data collection and writing review & editing.

527	Table 1. Description	of the days from	assessed MASK-air <sup>®</sup> u	isers
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	Days assessed for cut-off	Days assessed for cut-off
	estimation in the	estimation in the machine
	percentile-based approach	learning data-driven
	(N= <b>395</b> ,223)	approach (N=77,217)
N users (average days per user) <sup>a</sup>	23,201 (17.0)	7019 (11.0)
Females $-N(\%)$	219,660 (55.6)	43,569 (56.4)
Age – mean (SD)	38.0 (14.4)	40.2 (12.6)
VAS global allergy symptoms – median (IQR) <sup>b</sup>	11 (27)	15 (26)
VAS nose – median (IQR) <sup>b</sup>	12 (29)	15 (28)
VAS eyes – median (IQR) <sup>b</sup>	4 (18)	8 (21)
VAS asthma – median (IQR) <sup>b</sup>	0 (10)	4 (14)
Users with self-reported asthma	7 (23)	9 (22)
VAS work – median (IQR) <sup>b</sup>	8 (22) °	12 (23)
VAS sleep – median (IQR) <sup>b</sup>	16 (29) <sup>d</sup>	17 (30)
Allergic rhinitis CSMS – median (IQR) <sup>b</sup>	10 (18)	12 (18)
Total days reporting rhinitis medication – $N(\%)$	181,006 (45.8)	38,140 (49.4)
Oral antihistamines monotherapy	59,523 (15.1)	12,525 (16.2)
INCS monotherapy	35,941 (9.1)	7831 (10.1)
Azelastine-fluticasone monotherapy	14,747 (3.7)	2944 (3.8)
Oral antihistamines + INCS	35,346 (8.9)	7107 (9.2)
Azelastine-fluticasone + other rhinitis medication	12,897 (3.3)	2400 (3.1)
Self-reported asthma – $N(\%)$	155,484 (39.3)	33,390 (43.2)
Total days reporting asthma medication – $N(\%)$	82,390 (20.9)	18,996 (24.6)
SABA	9727 (2.5)	2444 (3.2)
ICS	25,697 (6.5)	6100 (7.9)
ICS+LABA	45,940 (11.6)	11,106 (14.4)
LAMA or biologics	3264 (0.8)	1060 (1.4)
Other medications	19,589 (5.0)	3978 (5.2)
Conjunctivitis – $N(\%)$	285,398 (72.2)	59,749 (77.4)

CSMS=Combined symptom-medication score; ICS=Inhaled corticosteroids; INCS= intranasal corticosteroids; IQR=Interquartile range; LABA=Long-acting beta-agonists; LAMA=Long-acting muscarinic antagonists; SABA=Short-acting beta-agonists; SD=Standard-deviation; VAS=Visual analog scale; <sup>a</sup>Median number of reported days per user: 2 for both approaches; <sup>b</sup> Scale: 0-100; <sup>c</sup> 182,245 days provided by 15,216 users; <sup>d</sup> 171,918 days provided by 9952 users.

#### Table 2. Cut-off points obtained for MASK-air® visual analog scales (VASs) according 532

	VAS global <sup>a</sup>	VAS nose <sup>a</sup>	VAS eye <sup>a</sup>	VAS asthma <sup>a</sup>
Percentile-oriented approach				
Identification of tertiles				
Cut-off 1 - Percentile 33	10	10	7	8
Cut-off 2 - Percentile 67	28	29	23	24
Identification of quartiles				
Cut-off 1 - Percentile 25	8	8	5	6
Cut-off 2 - Percentile 50	17	18	13	14
Cut-off 3 - Percentile 75	36	38	30	32
Data-driven approach				
Obtention of three clusters				
Cut-off 1	20	21	17	19
Cut-off 2	36	38	30	35
Obtention of four clusters				
Cut-off 1	16	17	13	14
Cut-off 2	32	32	25	30
Cut-off 3	39	42	30	37
e: 0-100				

533 to the percentile-oriented and machine learning data-driven approaches

534

535 Table 3. Proposed groups and cut-off points for MASK-air<sup>®</sup> visual analog scales (VASs)

	Percentile-	Data-driven
	oriented approach	approach
VAS global		
Full control	0	0
Good control	1-10	1-20
Partial control	11-27	21-35
Poor control	28-100	36-100
VAS nose		
Full control	0	0
Good control	1-10	1-21
Partial control	11-28	22-37
Poor control	29-100	38-100
VAS eye		
Full control	0	0
Good control	1-7	1-17
Partial control	8-22	18-29
Poor control	23-100	30-100
VAS asthma		
Full control	0	0
Good control	1-8	1-19
Partial control	9-23	20-34
Poor control	24-100	35-100

536 according to the percentile-oriented and data-driven approaches

537

#### **Figure captions** 538

539

540 Figure 1. Cross-sectional analysis of reported allergy symptoms with depiction of 541 median values of the visual analog scales (VASs) on global allergy symptoms and asthma 542 according to the day of MASK-air<sup>®</sup> use and for each reported medication scheme 543

544 ICS=Inhaled corticosteroids; INAH=Intranasal antihistamines; INCS=Intranasal corticosteroids; LABA=Long-acting beta-agonists; 545 LAMA=Long-acting muscarinic antagonists; OAH=Oral antihistamines; SABA=Short-acting beta-agonists 546

547

548 549 Figure 2. Longitudinal analysis of reported allergy symptoms with depiction of median values of the visual analog scales (VASs) on global allergy symptoms according to the 550 day of MASK-air<sup>®</sup> use. Included patients encompassed those who, on the first fifteen 551 552 days of MASK-air<sup>®</sup> use, reported at least fourteen days on the same medication scheme

553 554 555 INAH=Intranasal antihistamines; INCS=Intranasal corticosteroids; OAH=Oral antihistamines. INCS+INAH not depicted on account of the low number of participants

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- 627

628 629

VAS global allergy symptoms



Day

INCS + INAH











7<sup>9</sup> Day



VAS asthma









# Medication schemes

- --- No treatment [N users=312]
- OAH or INAH [N users=60]
- INCS [N users=45]
- - INCS + OAH [N users=47]

# Cut-offs

- - Arbitrary MASK-air cut-offs
- - Data-driven cut-offs