

# Respiratory rate-oxygenation index on the 3<sup>rd</sup> day is the best predictor of treatment failure in COVID-19 patients

Federico Raimondi,<sup>1</sup> Stefano Centanni,<sup>2,3</sup> Fabrizio Luppi,<sup>4,5</sup> Stefano Aliberti,<sup>6,7</sup> Francesco Blasi,<sup>3,8</sup> Paola Rogliani,<sup>9,10</sup> Claudio Micheletto,<sup>11</sup> Marco Contoli,<sup>12</sup> Alessandro Sanduzzi Zamparelli,<sup>13</sup> Marialuisa Bocchino,<sup>13</sup> Paolo Busatto,<sup>14</sup> Luca Novelli,<sup>1</sup> Simone Pappacena,<sup>1,3</sup> Luca Malandrino,<sup>1,3</sup> Giorgio Lorini,<sup>1</sup> Greta Carioli,<sup>15</sup> Fabiano Di Marco<sup>1,3</sup>

Correspondence: Luca Novelli, Pulmonary Medicine Unit, ASST Papa Giovanni XXIII, Piazza OMS 1, 24127 Bergamo, Italy. Tel.: +39 3394443927. E-mail: lnovelli@asst-pg23.it

Key words: ROX index, respiratory failure, COVID-19.

Contributions: FR, SC, LN, FDM, conceived the idea and designed the research; FR, LN, SP, LM, supervised clinical data team collection; FR, LN, SP, LM, GC, FDM, analyzed study data and developed statistical models and design of methodology; SC, FL, SA, FB, PR, CM, MC, ASZ, MB, PB, FDM, were the responsible for the research activity, management and coordination; FR, LN, SP, LM, GC, FDM, created and wrote the initial draft; SP, LM, prepared figures and tables; FR, LN, SP, LM, FDM, prepared the final version of manuscript. All the authors critically analyzed data, revised the draft, read and approved the final version of the manuscript.

Conflict of interest: the authors declare no potential conflict of interest.

Ethics approval and consent to participate: this study was approved by the respective ethics committees involved (Comitato etico di Bergamo - n.308-20, 05/02/2021; Comitato etico della Brianza - EC approval on 02/04/2021; Comitato etico di Ferrara - n.373/2021/Oss/AOUFe, 22/04/2021; Comitato etico Ospedale Sacco Milano - n.2021/ST/091, 19/04/2021; Comitato etico di Palermo - n.3/2021, 31/03/2021; Comitato etico Policinico Milano - n.433/2021, 23/04/2021; Comitato etico San Paolo Milano - n.965, 21/04/2021; Comitato etico di Verona - n.3171CESC, 11/03/2021).

Informed consent: informed consent was obtained from all participants.

Patient consent for publication: not applicable.

Availability of data and materials: data available from the corresponding author upon request.

Funding: this research did not receive any specific grant from funding agencies in the public, commercial, or not-for-profit sectors.

Received: 25 April 2024. Accepted: 17 September 2024. Early view: 24 October 2024.

Publisher's note: all claims expressed in this article are solely those of the authors and do not necessarily represent those of their affiliated organizations, or those of the publisher, the editors and the reviewers. Any product that may be evaluated in this article or claim that may be made by its manufacturer is not guaranteed or endorsed by the publisher.

<sup>®</sup>Copyright: the Author(s), 2024 Licensee PAGEPress, Italy Monaldi Archives for Chest Disease 2024; 94:3033 doi: 10.4081/monaldi.2024.3033

This article is distributed under the terms of the Creative Commons Attribution-NonCommercial International License (CC BY-NC 4.0) which permits any noncommercial use, distribution, and reproduction in any medium, provided the original author(s) and source are credited. <sup>1</sup>Respiratory Medicine Unit, ASST Papa Giovanni XXIII, Bergamo; <sup>2</sup>Respiratory Medicine Unit, ASST Santi Paolo e Carlo, Milan; <sup>3</sup>University of Milan; <sup>4</sup>Department of Medicine and Surgery, University of Milan Bicocca, Milan; <sup>5</sup>Respiratory Disease Unit, Fondazione IRCCS San Gerardo dei Tintori, Monza; <sup>6</sup>Department of Biomedical Sciences, Humanitas University, Pieve Emanuele; 7Respiratory Unit, IRCCS Humanitas Research Hospital, Rozzano, Milan; 8Respiratory Unit and Adult Cystic Fibrosis Center, Fondazione IRCCS Cà Granda Ospedale Maggiore Policlinico, Milan; 9"Tor Vergata" University, Rome: <sup>10</sup>Unit of Respiratory Medicine, "Tor Vergata" Hospital Foundation, Rome; <sup>11</sup>Respiratory Medicine Unit, University Hospital of Verona; <sup>12</sup>Department of Translational Medicine, University of Ferrara; <sup>13</sup>Department of Clinical Medicine and Surgery, Section of Respiratory Diseases, University Federico II, Azienda Ospedaliera dei Colli-Monaldi Hospital, Naples; <sup>14</sup>Pneumology, Ospedale di Lucca, Azienda USL Toscana Nord Ovest, Lucca; <sup>15</sup>FROM Research Foundation, Papa Giovanni XXIII Hospital, Bergamo, Italy

#### Abstract

Predictors of outcomes are essential to identifying severe COVID-19 cases and optimizing treatment and care settings. The respiratory rate-oxygenation (ROX) index, originally introduced for predicting the failure of non-invasive support in acute hypoxemic respiratory failure (AHRF), has not been extensively studied over time during hospitalization. This multicenter prospective observational study analyzed COVID-19-related AHRF patients admitted to eight Italian hospitals during the second pandemic wave. The study assessed the ROX index using receiver operator characteristic curves and areas under the curve with 95% confidence intervals to predict treatment failure, defined as endotracheal intubation (ETI) or death.

A total of 227 patients (69.2% males) were enrolled, with a median arterial partial pressure of oxygen (PaO2)/fraction of inspired oxygen (FIO<sub>2</sub>) ratio at admission of 248 (interquartile range: 170-295). Nearly one-third (29.5%) required ETI or died during hospitalization. Those who experienced treatment failure were older (median age 70 vs. 61 years, p<0.001), more likely to be current or former smokers (8.5% vs. 6.4% and 42.4% vs. 25.5%, p=0.039), had a higher prevalence of cardiovascular diseases (74.6% vs. 46.3%, p<0.001), and had a lower PaO<sub>2</sub>/FIO<sub>2</sub> ratio at presentation (median 229 vs. 254, p=0.014). Gender, body mass index, and other comorbidities showed no significant differences.

In patients who failed treatment, the ROX index was higher at presentation and worsened sharply by days 3 and 4. Conversely, in patients who survived without requiring ETI, the ROX index remained stable and reduced after 5-6 days. The ROX index's pre-



dictive ability improved notably by day 3 of hospitalization, with the best cut-off value identified at 8.53 (sensitivity 75%, specificity 68%). Kaplan-Meier curves indicated that a ROX index of 8.53 or lower on days 1, 2, or 3 was associated with a higher risk of treatment failure. Thus, a single ROX index assessment on day 3 is more informative than its variability over time, with values of 8.53 or lower predicting non-invasive respiratory support failure in hospitalized COVID-19 patients.

# Introduction

Since the beginning of the SARS-CoV-2 pandemic, several progress has been made in preventing and managing the most severe forms of the disease. The RECOVERY trial provided evidence that treatment with dexamethasone reduces 28-day mortality in patients with COVID-19 who are receiving respiratory support [1]. The extensive vaccination campaigns and the introduction of early therapies, as well as the reorganization of health facilities, contributed to reducing the disease burden and its pressure on hospitals and intensive care units (ICUs) [2]. However, despite these remarkable advances, the most frequent severe manifestation of COVID-19 remains interstitial pneumonia, leading to acute hypoxic respiratory failure (AHRF) in up to 20% of the cases [3,4]. The optimal management and site of care of AHRF patients with COVID-19 remain a matter of debate. On the one hand, it is necessary to avoid ICU overload. On the other hand, in patients who do not benefit from conventional oxygen therapy or non-invasive respiratory support strategies [i.e., high-flow nasal cannula (HFNC), continuous positive airway pressure (CPAP), non-invasive ventilation (NIV)], it is crucial not to delay endotracheal intubation (ETI) [5,6].

Therefore, predictors of outcome (*i.e.*, failure of non-invasive respiratory support) are fundamental in distinguishing these patients to optimize their treatment and site of care. In this regard, the heart rate (HR), acidosis, state of consciousness, oxygenation, and respiratory rate (HACOR) score, and the respiratory rate-oxygenation (ROX) index were introduced before the COVID-19 pandemic to predict failure of non-invasive support strategies in AHRF, with HACOR specifically focusing on the first hour of treatment [5]. Despite the ROX index, the ratio of peripheral oxygen saturation (SpO<sub>2</sub>) and fraction of inspired oxygen (FIO<sub>2</sub>) to respiratory rate (RR) was initially validated to predict failure of HFNC in patients with severe pneumonia (*i.e.*, score <3.85 within 12 hours) [7]; some studies also validated its usefulness in patients with COVID-19 pneumonia [8].

However, it should be considered that due to the pathophysiological peculiarities of respiratory failure in COVID-19, it is important to acquire prognostic information not only related to the first hours of admission but also during the first days of hospitalization and during non-invasive respiratory support trials [9]. The purpose of this investigation was, therefore, to evaluate the predictive role of the ROX index in identifying treatment failure (*i.e.*, ETI or death) of patients hospitalized because of COVID-19 pneumonia using data on the overall hospitalization.

### **Materials and Methods**

This multicentric, prospective, observational study was conducted in eight university-affiliated hospitals in Italy from August 2020 to August 2021. This study was approved by the Ethics Committee of the principal site in Bergamo, Italy (Comitato Etico di Bergamo, Italy. N°308/20) and by the respective Ethics Committees of the participating centers. Informed consent was obtained from all participants, and the study was conducted in compliance with the Declaration of Helsinki (2013). For critically ill patients or those unable to sign, verbal consent was given for routine clinical parameter collection. The present analysis included patients with confirmed SARS-CoV-2 infection, determined by a positive result on real-time polymerase chain reaction of oro- and nasopharyngeal swabs at the initial test and evidence of acute respiratory failure. At the time of admission to the respiratory unit, demographic data, medical history, respiratory parameters (i.e., type of respiratory support, FIO<sub>2</sub>, SpO<sub>2</sub>, RR), HR, systemic arterial blood pressure, and body temperature were collected. Radiologic assessments and all laboratory tests were performed according to local clinical practice and based on clinical needs. Respiratory parameters were evaluated at least once a day, when feasible, two measurements were taken, one in the morning and one in the evening. Based on these data, the ROX index was calculated using the formula (SpO<sub>2</sub>/FIO<sub>2</sub>)/RR [7]; when two measurements were available, the ROX index was expressed as the mean value. Data collection was performed until the main outcome was reached (*i.e.*, ETI or death) or the patient was discharged.

#### **Statistical analysis**

We used descriptive statistics to summarize patients' characteristics. Continuous variables were expressed as medians and interquartile ranges (IQRs) and categorical ones as counts and percentages. Patients characteristics were stratified for composite outcome (yes/no) and differences between groups were tested using the Mann-Whitney test for continuous variables and the chi-square test (or Fisher's exact test when appropriate) for categorical variables. We performed a mixed model for repeated measures (random intercept and random slope) to evaluate the ROX index trend over time and across strata of composite outcome. Receiver operator characteristic (ROC) curves of ROX index along with areas under the curve (AUC) and corresponding 95% confidence intervals (CIs) were evaluated to predict the need of ETI or death during the first week of hospitalization. However, the optimal ROX index to discriminate the composite outcome was determined considering in particular the first 3 days of hospitalization, due to the clinical relevance of this time interval for stabilization and trial of non-invasive respiratory support [10,11]. The predictive ability of the difference between the ROX index of day 3 and day 1 ( $\Delta$  ROX) and of the slope of ROX index over the first three days (obtained through a linear regression model,  $\beta$  ROX) was evaluated by analyzing the ROC curves and AUC. To identify the best cut-off for the ROX index, we used the ROC curves and the Liu method.

We computed time to event as the time, expressed in days, between the date of hospitalization and the date of the composite outcome, and we censored the time for patients free of events at the end of the follow-up period. Kaplan-Meier (KM) curves were stratified using the ROX index at day 1, 2 and 3; the cut-off for strata was computed on the highest AUC obtained and was used for stratifying ROX index both at day 1, and at day 2, and also at day 3. Differences in KM curves between strata of ROX index were tested using the log-rank test. Using Cox proportional hazards models, we estimated the hazard ratios (HRs) of composite outcome and the corresponding 95% CIs for ROX index, separately for days 1, 2, and 3.

For all tested hypotheses, two-sided p-values of 0.05 or less were considered significant. Statistical analysis was performed using STATA Software, release 16.1 (StataCorp LP, College Station TX, USA), and was carried out at the biostatistical laboratory of the Foundation for Research at Papa Giovanni XXIII Hospital in Bergamo.



#### **Results**

A total of 227 patients were evaluated. Their median (IQR) age was 63 (53-74) years, and 69.2% were male. The baseline characteristics are presented in Table 1. The population was generally overweight, with a median body mass index (BMI) of 27.7 kg/m<sup>2</sup>; 62.5% had never been smokers, while 7.0% and 30.5% were active and former smokers, respectively. The main comorbidities were cardiovascular diseases, type 2 diabetes mellitus, and chronic respiratory diseases (*Supplementary Table 1*). At hospital admission, arterial blood gas analysis showed a median (IQR) PaO<sub>2</sub>/FIO<sub>2</sub> ratio of 248 (170-295).

#### Features of patients according to main outcome

Nearly one-third of the population either required intubation or died during hospitalization (n=67, 29.5%). As shown in Table 1, compared to patients who were discharged alive, patients who either died or required intubation were older (median age 70 vs. 61 years, p<0.001), were more frequently smokers or former smokers (8.5%)

*vs.* 6.4% and 42.4% *vs.* 25.5%, p=0.039) and had a higher burden of cardiovascular disease (74.6% *vs.* 46.3%, p<0.001).

Moreover, they had a lower  $PaO_2/FIO_2$  ratio at presentation (median 229 *vs.* 254, p=0.014). There were no differences regarding gender, BMI, or other comorbidities (Table 1).

The trend of the ROX index during the first week of hospitalization, stratified by outcomes, is reported in Figure 1. As shown, the ROX index was higher already at presentation in those who survived [9.76 (6.94-13.79) vs. 7.19 (6.13-9.61), p<0.001]. The ROX index increased over time for no-ETI and alive patients, and, on the opposite, it was stable or slightly decreasing in patients who died or required ETI, indicating a different effect of the ROX index time trend across the composite outcome categories (p=0.0004).

# Predictive role of the respiratory rate-oxygenation index and the best cut-off

Figure 2 shows ROC curves of i) the ROX index over the first three days of hospitalization; ii)  $\Delta$  ROX and iii)  $\beta$  ROX. The ROX index of day 3 had the best predictive ability, showing the highest

#### Table 1. Baseline characteristics of 227 patients according to the outcome.

$\begin{array}{cccccccccccccccccccccccccccccccccccc$	<b>=160</b> (52-71) 7 (24) 2 (26) 0 (25) 1 (25) 09 (68) (1 (32) (25-31)	n=227 63 (53-74) 44 (20) 51 (22) 58 (25) 74 (32) 157 (69)	Age, median (IQR) ≤50, n (%) 51-60, n (%) 61-70, n (%) >70, n (%) Sex, n (%) Men
ge, median (IQR) $63 (53-74)$ $61 (52-71)$ $70 (62-80)$ $<0.001$ $\leq 50, n$ (%) $44 (20)$ $37 (24)$ $7 (11)$ $0.001$ $51-60, n$ (%) $51 (22)$ $42 (26)$ $9 (13)$ $51-70, n$ (%) $58 (25)$ $40 (25)$ $18 (27)$ $>70, n$ (%) $74 (32)$ $41 (25)$ $33 (49)$ ex, n (%) $88 (27)$ $0.600$ Women $70 (31)$ $51 (32)$ $19 (28)$ MI, median (IQR) $28 (25-31)$ $28 (25-31)$ $28 (25-32)$ $0.740$ $<20.0, n$ (%) $2 (1)$ $2 (1)$ $0 (0)$ $20.0-24.9, n$ (%) $35 (15)$ $24 (15)$ $11 (16)$ $25.0-29.9, n$ (%) $102 (45)$ $81 (51)$ $21 (31)$ $\geq 30.0, n$ (%) $0.039$ $88 (39)$ $53 (33)$ $35 (52)$ moke, n (%) $0.039$ $96 (68)$ $29 (49)$ Yes $14 (7)$ $9 (6)$ $5 (9)$	(52-71) 7 (24) 2 (26) 0 (25) -1 (25) -09 (68) -1 (32) (25-31)	63 (53-74) 44 (20) 51 (22) 58 (25) 74 (32) 157 (69)	≤50, n (%) 51-60, n (%) 61-70, n (%) >70, n (%) Sex, n (%)
$\begin{array}{cccccccccccccccccccccccccccccccccccc$	7 (24) 2 (26) 0 (25) 1 (25) 09 (68) 1 (32) (25-31)	44 (20) 51 (22) 58 (25) 74 (32) 157 (69)	≤50, n (%) 51-60, n (%) 61-70, n (%) >70, n (%) Sex, n (%)
$\begin{array}{cccccccccccccccccccccccccccccccccccc$	2 (26) 0 (25) 1 (25) 09 (68) 1 (32) (25-31)	51 (22) 58 (25) 74 (32) 157 (69)	51-60, n (%) 61-70, n (%) >70, n (%) Sex, n (%)
	0 (25) 1 (25) 09 (68) 1 (32) (25-31)	58 (25) 74 (32) 157 (69)	61-70, n (%) >70, n (%) Sex, n (%)
$\begin{array}{c c c c c c c c c c c c c c c c c c c $	09 (68) (1 (32) (25-31)	74 (32) 157 (69)	>70, n (%) Sex, n (%)
ex, n (%)Men157 (69)109 (68)48 (72)0.600Women70 (31)51 (32)19 (28)MI, median (IQR)28 (25-31)28 (25-31)28 (25-32)0.740<20.0, n (%)	09 (68) 11 (32) (25-31)	157 (69)	Sex, n (%)
Men157 (69)109 (68)48 (72)0.600Women70 (31)51 (32)19 (28)MI, median (IQR)28 (25-31)28 (25-32)0.740<20.0, n (%)	(25-31)		
Women $70 (31)$ $51 (32)$ $19 (28)$ MI, median (IQR) $28 (25-31)$ $28 (25-31)$ $28 (25-32)$ $0.740$ $<20.0, n (%)$ $2 (1)$ $2 (1)$ $0 (0)$ $20.0-24.9, n (%)$ $35 (15)$ $24 (15)$ $11 (16)$ $25.0-29.9, n (%)$ $102 (45)$ $81 (51)$ $21 (31)$ $\geq 30.0, n (%)$ $88 (39)$ $53 (33)$ $35 (52)$ moke, n (%) $0.039$ $125 (63)$ $96 (68)$ $29 (49)$ Yes $14 (7)$ $9 (6)$ $5 (9)$	(25-31)		Men
MI, median (IQR) $28 (25-31)$ $28 (25-32)$ $0.740$ <20.0, n (%)	(25-31)	/0(31)	
$\begin{array}{cccccccccccccccccccccccccccccccccccc$	· /	· · · ·	
$20.0-24.9, n$ (%) $35$ (15) $24$ (15) $11$ (16) $25.0-29.9, n$ (%) $102$ (45) $81$ (51) $21$ (31) $\geq 30.0, n$ (%) $88$ (39) $53$ (33) $35$ (52)moke, n (%) $0.039$ $0.039$ $29$ (49)No $125$ (63) $96$ (68) $29$ (49)Yes $14$ (7) $9$ (6) $5$ (9)			· · · · · · · · · · · · · · · · · · ·
$\begin{array}{cccccccccccccccccccccccccccccccccccc$			
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$	< / /		
0.039     No   125 (63)   96 (68)   29 (49)     Yes   14 (7)   9 (6)   5 (9)			
No   125 (63)   96 (68)   29 (49)     Yes   14 (7)   9 (6)   5 (9)	5 (55)	· · ·	
Yes 14 (7) 9 (6) 5 (9)	6 (68)		No
	· · /		Yes
		61 (31)	Ex
nmunocompromission, n (%) 12 (5) 6 (4) 6 (9) 0.110	6 (4)	12 (5)	mmunocompromission, n (%)
efropathies, n (%) 12 (5) 6 (4) 6 (9) 0.110	6 (4)	12 (5)	Nefropathies, n (%)
ulmonary diseases°, n (%) 28 (12) 16 (10) 12 (18) 0.098	6 (10)	28 (12)	Pulmonary diseases°, n (%)
iver diseases, n (%) 10 (4) 6 (4) 4 (6) 0.490	6 (4)	10 (4)	Liver diseases, n (%)
ardiovascular diseases <sup>#</sup> , n (%) 124 (55) 74 (46) 50 (75) <0.001	4 (46)	124 (55)	Cardiovascular diseases#, n (%)
olid active neoplasia, n (%)   9 (4)   5 (3)   4 (6)   0.460	5 (3)	9 (4)	Solid active neoplasia, n (%)
iabetes, n (%) 38 (17) 23 (14) 15 (22) 0.140	3 (14)	38 (17)	Diabetes, n (%)
eurological disease, n (%)20 (9)11 (7)9 (13)0.120	11 (7)	20 (9)	Neurological disease, n (%)
ematological disease, n (%) 11 (5) 5 (3) 6 (9) 0.062	5 (3)	11 (5)	Hematological disease, n (%)
atologia reumatologica, n (%) 9 (4) 6 (4) 3 (5) 0.730	6 (4)	9 (4)	Patologia reumatologica, n (%)
aO <sub>2</sub> /FIO <sub>2</sub> (at first ABG), median (IQR) 248 (170-295) 254 (189-297) 229 (120-286) 0.014	(189-297)	248 (170-295)	PaO <sub>2</sub> /FIO <sub>2</sub> (at first ABG), median (IQR)
OX day 1, median (IQR)   8.65 (6.46-12.91)   9.76 (6.94-13.79)   7.19 (6.13-9.61)   <0.001	6.94-13.79)	8.65 (6.46-12.91)	ROX day 1, median (IQR)
OX day 2, median (IQR)   9.10 (6.89-12.59)   9.70 (7.53-14.05)   7.33 (5.48-9.66)   <0.001	7.53-14.05)	9.10 (6.89-12.59)	ROX day 2, median (IQR)
OX day 3, median (IQR)   9.37 (6.94-12.43)   10.22 (8.00-13.11)   6.95 (5.82-8.75)   <0.001	(8 00-13 11)	9 37 (6 94-12 43)	POV day 3 median (IOP)

ETI, endotracheal intubation; IQR, interquartile range; BMI, body mass index; PaO<sub>2</sub>, arterial partial pressure of oxygen; FIO<sub>2</sub>, fraction of inspired oxygen; ABG, arterial blood gas analysis; ROX, respiratory rate-oxygenation index; <sup>o</sup>includes COPD, asthma, interstitial lung diseases, bronchiectases; <sup>#</sup>includes arterial hypertension, dyslipidemia, cardiovascular diseases, (valvular diseases, hypertensive or ischemic cardiomyopathy, atrial fibrillation, arterial vasculopathy).





**Figure 1.** Daily median respiratory rate-oxygenation index trend, overall and stratified by outcome [endotracheal intubation (ETI) and death combined]. \*p for interaction between time and outcome (ETI and death combined) obtained from a mixed model – random intercept and random slope. IQR, interquartile range; ROX, respiratory rate-oxygenation index.



**Figure 2.** Receiver operator characteristic curves of respiratory rate-oxygenation (ROX) index at day 1, 2 and 3, of  $\Delta$  between ROX index at day 1 and ROX index at day 3, and of regression coefficient  $\beta$  of ROX index at day 1 to 3 for outcome endotracheal intubation and death combined. AUC, area under the curve.

AUC (0.79, 95% CI 0.72-0.85). Supplemental analyses were performed considering ROC curves of ROX indexes over the first week, confirming the improvement in the predictive capacity of the ROX index from day 3 (*Supplementary Figure 1*).

The best cut-off of the ROX index at day 3 was 8.53 (sensitivity 75%; specificity 68%). The ROX index cut-off of 8.53 was used to investigate the ETI-free survival of the study population. KM curves show that patients with ROX index (both at day 1, and at day 2 and also at day 3) lower or equal than 8.53 have a higher risk of treatment failure (Figure 3; HR for ROX index at day 3 $\leq$ 8.53 was 3.6, 95% CI 2.10-6.13; HR for ROX index at day 2 $\leq$ 8.53 was 2.0, 95% CI 1.23-3.34; HR for ROX index at day 1 $\leq$ 8.53 was 2.5, 95% CI 1.46-4.16).

## **Discussion and Conclusions**

The main results from this study can be summarized as follows: i) the median value of the ROX index is lower in COVID-19 subjects who fail treatment, already at the time of hospital admission (7.19 vs. 9.76); ii) a ROX index  $\leq$ 8.53 is a good predictive value of





Figure 3. Kaplan-Meier curves stratified by respiratory rate-oxygenation (ROX) index (cut-off 8.53) at day 1, 2, and 3. The cut-off was computed as the best one on the ROX index on day 3. ETI, endotracheal intubation.

treatment failure at any time; iii) considering the timing of ROX index assessment, evaluation on day 3 since hospitalization is the best predictor of treatment failure; iv) single assessment of the ROX index on day 3 is more predictive than its variability over time.

Our study population is comparable to larger cohorts of patients hospitalized due to COVID-19 pneumonia, in terms of anthropometric characteristics and outcomes (*i.e.*, ETI or death) [12,13]. The main contribution of this study is given by the evaluation of the ROX index over a long period of time (*i.e.*, one week), while previous studies are generally focused on the first hours of treatment [14].

In a particular scenario, such as that of the pandemic, evaluation over a longer interval can offer advantages and better reflect what is daily clinical practice. In fact, except in conditions of instability, only a minority of COVID-19 patients are intubated in the first 24 hours [15], while most patients undergo clinical stability and possibly non-invasive respiratory support escalation during the first 48-72 hours [16,17]. Therefore, exploring the predictive role of ROX at this stage can be useful in understanding how to prioritize the intensification of patients at risk of treatment failure.

Before the COVID-19 pandemic, Roca et al. described the ROX index to predict the need for invasive ventilation among

patients with pneumonia and acute respiratory failure treated with HFNC, showing that a ROX index  $\geq$ 4.88 measured in the very first hours after HFNC therapy indicated a lower risk for treatment failure, while a ROX index  $\leq$ 3.85 at 12 hours was a predictor of HFNC failure [7].

This threshold was then used by Myers *et al.* to validate ROX in a cohort of inpatients with COVID-19-related respiratory failure treated with HFNC [8]. Using a ROX threshold of 3.85, they found a positive predictive value of 59.4% (need for invasive mechanical ventilation).

However, when investigating ROX thresholds in the context of COVID-19, the results seem to be quite heterogeneous and partly differ from what has been described by Roca *et al.* 

During the first pandemic wave, Zaboli *et al.* compared the ROX value obtained at triage with the medical diagnosis of acute respiratory distress syndrome (ARDS) and intubation at 72 hours [18]. Those who developed ARDS or underwent intubation had a lower average median ROX index (value of 13.1 and 15.3, respectively) compared to those who did not develop ARDS or did not require intubation (value of 25.2 and 22.2, respectively).

Similarly, Suliman et al. validated the ROX index on day 1 (cut-



off value  $\leq 25.26$ ), for predicting the risk of intubation in COVID-19 patients using the HFNC [10]. Moreover, the ROX index was investigated as a prognostic indicator among COVID-19 patients receiving CPAP, showing that values >6.32 pre-CPAP and >7.77 after 24 hours of CPAP therapy were indicative of successful weaning in >80% of the cases [19].

In accordance with our results, ROX thresholds in COVID-19 are generally higher than those of Roca *et al.* [7]. The reason behind this diversity has not been fully understood yet. However, it is possible that the heterogeneity of the study populations, which often include moderate cases, may have contributed to raising the threshold. Furthermore, relatively preserved pulmonary compliance is described during the early stages of the disease [20]. Therefore, it can be hypothesized that this accounts for a lower RR, also observed in so-called "silent hypoxia" cases, which would justify a higher ROX index [21]. Another confounding factor can be the role of shunt or blunted hypoxic pulmonary vasoconstriction in COVID-19. The administration of high FIO<sub>2</sub> in the case of pulmonary shunt, which is a condition of FIO<sub>2</sub> insensitiveness, can lead to an artifactual alteration of the respiratory exchange indices [22].

To the best of our knowledge, this is the first study to evaluate the ROX index over such a large time interval (i.e., one week). The most interesting result, balancing the clinical needs with the utility of a prognostic index, was the evaluation on day 3. Indeed, the patient has generally been stabilized and has started trials of noninvasive respiratory support during the first 72 hours of hospitalization; at this point it is essential to have a prognostic tool to help us decide how to proceed. We identified a ROX index of 8.53 on day 3 (sensitivity 75%; specificity 68%) as the best cut-off for predicting failure of noninvasive respiratory support. Our cut-off limit is comparable to the threshold (ROX index = 6.64 at 24 hours) identified by Colaianni-Alfonso et al. in a recent study that evaluated the outcome of COVID-19 patients treated with CPAP [23], and also with the threshold (ROX index = 6.86 at 24 hours) found by Nova *et al.* when investigating the likelihood of NIV success in COVID-19 patients [24].

As already anticipated, studies that evaluate the ROX after the first 24 hours are not frequent. However, the results of Suliman et al. [10] during the first 3 days of hospitalization, demonstrate an increasing predictive capacity of ROX over time (ROX ≤11.71 on day 3; 90% of sensitivity and 100% of specificity, AUC 0.967, p $\leq$ 0.001). Regarding ROX variation over time (*i.e.*,  $\Delta$  ROX), the evidence is even more limited. A recent study by Abroug et al. showed that the difference between ROX at 12 hours and at baseline (ICU admission) increased significantly more in the HFNC success group compared to the group failing this therapy (medians 2.7 vs. 0.47, respectively), finding a  $\triangle$  ROX cut-off $\leq 1.8$  as the best index to predict HFNC failure (sensitivity 0.89 and specificity 0.61) [25]. We investigated the ROX variation over a wider period ( $\Delta ROX_{3-1}$ ) and the slope of the first three ROX values (linear regression,  $\beta$ ); however, predictive capabilities were not superior to those of ROX on day 3 (AUC  $\triangle ROX_{3-1}$  0.6079 and  $\beta$  0.6010 vs. ROX.3 0.7862). Therefore, the threshold of 8.53 on day 3 can be interpreted as a more powerful prognostic index than the clinical trend. In other words, a patient who is improving but does not reach the expected cut-off on day 3 deserves greater clinical attention.

Our study has some limitations. Firstly, the study population was heterogeneous and had different degrees of respiratory insufficiency managed with different respiratory supports. However, we purposely enrolled a population that was representative of hospital management outside the ICU area. Therefore, the cut-offs that have been found are useful in evaluating a patient who undergoes clinical stabilization and possibly respiratory support escalation for a few days, which is the most common scenario in daily clinical practice. Secondly, studies on the ROX index generally evaluate multiple measurements of the index over the first 24 hours from the start of treatment, while in our study, we had one measure per day for the first week of hospitalization. This choice was made to investigate the predictive capacity of ROX when measured like other vital parameters in a non-intensive setting. Finally, the multicenter nature of the study may have led to differences in the intensification criteria or respiratory management of patients. However, this study considered the second and the third pandemic peak in Italy, when the treatment and respiratory support protocols were more homogeneous than in the first pandemic peak. Furthermore, the simplicity of the calculation of the ROX index can hardly lead to errors in the data collection.

In conclusion, the ROX index has shown to be a practical prognostic tool for COVID-19. A single assessment of the ROX index on day 3 since hospitalization is more informative than its variability over time, and a value  $\leq 8.53$  is predictive of failure of non-invasive respiratory support. This finding is useful in identifying patients at risk for unfavorable outcomes and guiding the decisionmaking process.

#### References

- 1. The RECOVERY Collaborative Group. Dexamethasone in hospitalized patients with Covid-19. N Engl J Med 2021;384:693-704.
- Havers FP, Pham H, Taylor CA, et al. COVID-19-associated hospitalizations among vaccinated and unvaccinated adults 18 years or older in 13 US states, january 2021 to april 2022. JAMA Intern Med 2022;182:1071-81.
- 3. Weiss P, Murdoch DR. Clinical course and mortality risk of severe COVID-19. Lancet 2020;395:1014-5.
- 4. Wu Z, McGoogan JM. Characteristics of and important lessons from the coronavirus disease 2019 (COVID-19) outbreak in China. JAMA 2020;323:1239-42.
- Valencia CF, Lucero OD, Castro OC, et al. Comparison of ROX and HACOR scales to predict high-flow nasal cannula failure in patients with SARS-CoV-2 pneumonia. Sci Rep 2021;11:22559.
- Oczkowski S, Ergan B, Bos L, et al. ERS clinical practice guidelines: high-flow nasal cannula in acute respiratory failure. Eur Respir J 2022;59:2101574.
- Roca O, Messika J, Caralt B, et al. Predicting success of highflow nasal cannula in pneumonia patients with hypoxemic respiratory failure: the utility of the ROX index. J Crit Care 2016; 35:200-5.
- Myers LC, Mark D, Ley B, et al. Validation of respiratory rateoxygenation index in patients with COVID-19–related respiratory failure. Crit Care Med 2022;50:e638-42.
- 9. Cosentini R, Groff P, Brambilla AM, et al. SIMEU position paper on non-invasive respiratory support in COVID-19 pneumonia. Intern Emerg Med 2022;17:1175-89.
- Suliman L, Abdelgawad T, Farrag N, et al. Validity of ROX index in prediction of risk of intubation in patients with COVID-19 pneumonia. Adv Respir Med 2020;89:1-7.
- Rochwerg B, Brochard L, Elliott MW, et al. Official ERS/ATS clinical practice guidelines: noninvasive ventilation for acute respiratory failure. Eur Respir J 2017;50:1602426.
- Hoogenboom WS, Pham A, Anand H, et al. Clinical characteristics of the first and second COVID-19 waves in the Bronx, New York: a retrospective cohort study. Lancet Reg Health Am 2021;3:100041.



- 13. Grasselli G, Zangrillo A, Zanella A, et al. Baseline characteristics and outcomes of 1591 patients infected with SARS-CoV-2 admitted to ICUs of the Lombardy region, Italy, JAMA 2020:323:1574-81.
- 14. Vega ML, Dongilli R, Olaizola G, et al. COVID-19 pneumonia and ROX index: time to set a new threshold for patients admitted outside the ICU. Pulmonology 2022;28:13-7.
- 15. Novelli L, Raimondi F, Ghirardi A, et al. At the peak of COVID-19 age and disease severity but not comorbidities are predictors of mortality: COVID-19 burden in Bergamo, Italy. Panminerva Med 2021;63:51-61.
- 16. Papoutsi E, Giannakoulis VG, Xourgia E, et al. Effect of timing of intubation on clinical outcomes of critically ill patients with COVID-19: a systematic review and meta-analysis of non-randomized cohort studies. Crit Care 2021:25:121.
- 17. Boscolo A, Pasin L, Sella N, et al. Outcomes of COVID-19 patients intubated after failure of non-invasive ventilation: a multicenter observational study. Sci Rep 2021;11:17730.
- 18. Zaboli A, Ausserhofer D, Pfeifer N, et al. The ROX index can be a useful tool for the triage evaluation of COVID-19 patients with dyspnoea. J Adv Nurs 2021;77:3361-9.
- 19. Melo-Diaz LL, Kieling GA. The ROX index: "propelled" by high-flow nasal cannula therapy during the COVID-19 pandem-

ic into greater applicability in respiratory support. Can J Respir Ther 2022;58:182-4.

- 20. Gattinoni L, Coppola S, Cressoni M, et al. COVID-19 does not lead to a "typical" acute respiratory distress syndrome. Am J Respir Crit Care Med 2020;201:1299-300.
- 21. Novelli L, Raimondi F, Ghirardi A, et al. Frequency, characteristics, and outcome of patients with COVID-19 pneumonia and 'silent hypoxemia' at admission: a severity-matched analysis. Panminerva Med 2022;64:442-51.
- 22. Raimondi F, Novelli L, Marchesi G, et al. Worsening of gas exchange parameters at high FiO2 in COVID-19: misleading or informative? Multidiscip Respir Med 2021;16:759.
- 23. Colaianni-Alfonso N, Montiel GC, Castro-Sayat M, et al. ROX index to predict CPAP outcome in hypoxemic respiratory failure due to COVID-19. Intensive Care Med 2022:48:1818-9.
- 24. Nova A, Rezoagli E, Eronia N, et al. Role of PEEP on the prognostic performance of the ROX index in hypoxemic respiratory failure due to COVID-19: any further gain in outcome prediction? Intensive Care Med 2023;49:355-6.
- 25. Abroug F, Hammouda Z, Lahmar M, et al. Early variation of ROX index predicts high-flow nasal cannula outcome in awake subjects with severe hypoxemic COVID-19. Respir Care 2023;68:110-3.

Online supplementary material:

Article

Supplementary Table 1. Detailed pneumological and cardiologic diseases according to the outcome combined.

Supplementary Figure 1. Receiver operator characteristic curves of respiratory rate-oxygenation index at day 1 to 7 for outcome endotracheal intubation and death combined.