



# Patient-reported questionnaires to preoperatively identify high-risk surgical patients

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## Abstract

**Purpose** Low cardiorespiratory fitness (CRF) increases the risk of postoperative morbidity and mortality following major surgery. Assessing CRF preoperatively, by measuring peak oxygen uptake ( $VO_{2peak}$ ) during cardiopulmonary exercise testing (CPET), is valuable yet not widely available. This study aimed to assess whether questionnaires could be used preoperatively to identify high-risk surgical patients.

**Methods** Healthy participants and patients who underwent CPET completed the FitMáx, Duke Activity Status Index (DASI), the modified 4-questions DASI (M-DASI-4Q), Veterans-Specific Activity Questionnaire (VSAQ), and Metabolic Equivalents of Task (MET) questionnaire. Questionnaire- $VO_{2peak}$  was compared with CPET- $VO_{2peak}$ . Overall performance of the questionnaires was assessed by the area under the curve (AUC) of receiver operating characteristic (ROC) curves. Furthermore, corresponding to the Youden index or pre-specified levels, sensitivity, specificity, and predictive values were determined.

**Results** In total, 361 participants were included. All questionnaires showed high AUC values to identify high-risk patients, defined on the basis of CPET- $VO_{2peak}$  thresholds. FitMáx and VSAQ demonstrated superior results compared to the other questionnaires. Based on the Youden index, the optimal questionnaire- $VO_{2peak}$  cut-off values were 20.6, 21.3, and 26.1  $ml \cdot kg^{-1} \cdot min^{-1}$  for the FitMáx and 16.3, 18.2, and 20.4  $ml \cdot kg^{-1} \cdot min^{-1}$  for the VSAQ corresponding to the  $VO_{2peak}$  thresholds 16.0, 18.2 and 24.5  $ml \cdot kg^{-1} \cdot min^{-1}$  respectively.

**Conclusion** The ability to identify high-risk surgical patients preoperatively (defined by the CPET- $VO_{2peak}$  thresholds) by the FitMáx and the VSAQ indicates that they could be used to identify high-risk surgical patients. Patients with a poor predicted  $VO_{2peak} \leq 21.3$  and  $\leq 18.2$   $ml \cdot kg^{-1} \cdot min^{-1}$ , respectively for FitMáx and VSAQ, should be referred to formal preoperative (cardiopulmonary) exercise testing.

**Trial registration** The study was registered as NL-OMON23304 in the Overview of Medical Research in the Netherlands, retrospectively at 28-04-2020.

**Keywords** Aerobic fitness · Cardiopulmonary exercise testing · Preoperative risk assessment · Preoperative care · Patient-reported outcome measure

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## Introduction

Cardiorespiratory fitness (CRF) is defined as the integrated capacity to take in, transport, and utilise oxygen; thus it provides a reflection of an individual's functional capacity [1]. Surgery imposes increased metabolic demands on the body's cardiorespiratory system. Patients with low CRF are more prone to worse surgical outcomes, such as complications, longer length of hospital stay, and postoperative mortality [2–4]. Especially in high-risk patients, promising effects of (p)rehabilitation programmes are observed, emphasising the importance to timely identify and counsel patients with low CRF to consider preventive preoperative interventions [5–9].

In current clinical preoperative practice, functional capacity is often assessed subjectively by anaesthesiologists, using a scoring system such as the American Society of Anaesthesiologists (ASA) physical status classification [10, 11]. In contrast, CRF assessment by objectively measuring oxygen uptake at peak exercise ( $VO_{2peak}$ ) during maximal cardiopulmonary exercise testing (CPET) is considered the gold standard and leads to a more accurate risk assessment [11, 12]. CPET provides useful information for perioperative risks and detects the cause of exercise limitation [13, 14]. Several risk thresholds have been described for objectively measured preoperative  $VO_{2peak}$  to predict postoperative complications [15–17]. However, performing CPET is costly, labour-intensive, and interpretation is difficult, especially in patients with (multiple) comorbidities; therefore, it is not widely applicable for preoperative risk assessment [18, 19]. Moreover, CPET outcome measures showed a consistent variability in repeated testing in unfit patients, leading to the requirement for more reliable ways to determine  $VO_{2peak}$  [20].

Patient-reported questionnaires are frequently used as an alternative to estimate  $VO_{2peak}$  [21]. Examples of such questionnaires are the FitMáx© questionnaire (hereafter FitMáx) [22], the Duke Activity Status Index (DASI) [23], the modified version of the DASI with only four questions (M-DASI-4Q) [24], the Veterans-Specific Activity Questionnaire (VSAQ) [25], and the Metabolic Equivalents of Task (MET) questionnaire (commonly used in The Netherlands) based on the international compendium for MET [26]. A limitation of these questionnaires is the use of activities that are not performed worldwide (e.g., basketball, cross-country skiing, cycling) [22, 27]. Correlations of these self-reported questionnaires with objectively assessed CPET- $VO_{2peak}$  vary among different study populations, and particularly detecting patients with a low CRF remains difficult [12, 23, 25, 28–31]. The accuracy of these questionnaires to detect predefined clinically relevant  $VO_{2peak}$  thresholds is unknown. Therefore, the main

aim of this study was to evaluate whether self-reported questionnaires could be used in the preoperative evaluation to identify high-risk surgical patients, using predefined clinically relevant  $VO_{2peak}$  thresholds corresponding to a higher risk for complications.

## Material and methods

### Setting and population

Patients and healthy participants aged  $\geq 18$  years who were scheduled for CPET, either for medical purposes or as part of a general health check, were approached for participation in the current study. Data was collected at the Máxima Medical Centre (MMC), a Dutch non-academic teaching hospital, and Ancora Health, a digital start-up in preventive healthcare in the Netherlands, from 2018–2024. Ethical approval for this study (reference number N18.051) was provided by the authorised Medical Research Ethics Committee of the MMC, Veldhoven, on 30 April 2018 (reference number N18.051). Data from participants in previous (external validation group of the FitMáx prediction model) and ongoing studies were included retrospectively in the current study [22, 30, 32]. Subjects were eligible for inclusion if they were proficient in the Dutch language and completed the questionnaires within 42 days from the day of CPET. The ASA classification, of the included general population, was determined following the guidelines of the American society of Anaesthesiologists to assess the participants' physical status [10, 11]. All participants provided written informed consent for the use of their data.

### Cardiopulmonary exercise testing

CPET was conducted in accordance with international recommendations [33]. Pre-test instructions included intake of regular medication, as well as no heavy exercise and no large meal two hours prior to the exercise test. The CPET protocol is extensively described in our FitMáx validation study [22]. All tests aborted for medical reasons (substantial ECG changes, cardiac symptoms, severe orthopaedic problems) were excluded.  $VO_{2peak}$  was calculated using the 30-s average of  $VO_2$  values prior to peak exercise and was subsequently normalised for body mass.

### Self-reported questionnaires

FitMáx consists of three single-answer questions to estimate a subject's maximum capacity of walking, cycling, and stair climbing on a 14-point, 12-point, and 11-point scale, respectively. FitMáx scores for each item were incorporated with

age, sex, and body mass index into a prediction algorithm to estimate  $VO_{2peak}$  [22]. The DASI includes 12 daily activities, of which a weighted sum score leads to an estimated  $VO_{2peak}$  value. Scores range from 0 to 58.2, resulting in  $VO_{2peak}$  values from 9.6 to 34.6  $ml \cdot kg^{-1} \cdot min^{-1}$  [23]. More recently, a study on the M-DASI-4Q was performed, in which only four questions of the original DASI were selected to predict the preoperative risk of complications [24]. For the M-DASI-4Q, no algorithm to estimate  $VO_{2peak}$  was available. As such, only the score of the M-DASI-4Q on a scale from 1–4 was included. The VSAQ focuses on daily activities ordered with increasing difficulty on a 13-point scale, of which the first limiting activity corresponds to an equivalent number of maximal METs. This MET score is combined with age to estimate  $VO_{2peak}$  [25]. The results of the FitMáx, DASI, and VSAQ were converted into  $VO_{2peak}$  in  $ml \cdot kg^{-1} \cdot min^{-1}$ , following the guidelines of each questionnaire [22, 23, 25]. The MET questionnaire is applied preoperatively by anaesthesiologists in (Dutch) hospitals, to assess CRF. It consists of 9 items with increasing MET values based on the globally used MET compendium of physical activities, in which the subject is asked to rate their maximum capacity [26].  $VO_{2peak}$  values were calculated by multiplying the reported MET scores by 3.5  $ml \cdot kg^{-1} \cdot min^{-1}$ .

## Statistical analysis

Normality of the data was visually evaluated by histograms and naïve assessment of skewness and kurtosis [34]. Continuous variables are reported as mean  $\pm$  standard deviation in case of normal distribution, and median and interquartile range (IQR) otherwise. Categorical variables are presented as count  $n$  with percentage (%).

The American Heart Association stated that for patients with a MET value  $\geq 7$  ( $VO_{2peak} \geq 24.5$   $ml \cdot kg^{-1} \cdot min^{-1}$ ), preoperative CPET had no additional value, since the risk of perioperative cardiovascular events was low [17]. Furthermore, literature suggests that a  $VO_{2peak}$  of  $\leq 16.0$  or  $\leq 18.2$   $ml \cdot kg^{-1} \cdot min^{-1}$  is significantly associated with an increased risk of postoperative complications [15, 16]. These  $VO_{2peak}$  thresholds were selected for the current study as an indicator of a higher preoperative risk for complications. Receiver operating characteristic (ROC) curves were used as a graphical approach to compare the performance of the questionnaires, separately at the considered  $VO_{2peak}$  thresholds ( $\leq 16.0$ ,  $\leq 18.2$ , and  $\leq 24.5$   $ml \cdot kg^{-1} \cdot min^{-1}$ ). The area under the curve (AUC) was determined, with corresponding 95% confidence intervals (CI) [35]. Also, the optimal cut-off value in the prediction from the questionnaires was determined as the one maximizing the Youden index, the maximum difference between sensitivity (the probability of correctly classifying subjects below the predefined  $VO_{2peak}$  thresholds), and the complementary of specificity

(the probability of incorrectly classifying subjects above the predefined  $VO_{2peak}$  thresholds) [36]. In clinical practice, a high sensitivity may be more important than specificity to prevent false negative outcomes [37]. Since the Youden index does not distinguish between the importance of these two measures, the optimal FitMáx cut-off value for predetermined sensitivity values from 0 to 1 in steps of 0.05 were also presented [38]. Sensitivity, specificity and predictive values were calculated for the questionnaire cut-off values [37, 39]. We have also quantitatively compared the considered metrics (AUC [35], Youden index [36, 40], and predetermined sensitivity [38]), pairwise between the FitMáx and the other questionnaires, and applied the Benjamini–Hochberg correction for multiple testing [41]. This was done in the pROC package in R, using the stratified bootstrap option (10000 bootstrap replicates; retaining similar case-controls observations) [35, 42, 43]. To assess the performance of the questionnaires in a subpopulation that is at higher preoperative risk for complications (ASA > II) [11], the same analyses were repeated on two subgroups based on the ASA physical status classification (I-II and III-IV). Statistical analysis was performed using R (R-version 4.3.1) [44]. All p-values < 0.05 were considered statistically significant.

## Results

In total, 361 participants (277 men and 84 women) were eligible for analyses (e.g., complete cases, within 42 days of CPET). Participants' age ranged from 19–90 years with a  $VO_{2peak}$  ranging from 7.8–71.4  $ml \cdot kg^{-1} \cdot min^{-1}$ . Cardiac evaluation (58%) was the most common reason for CPET in men and pulmonary evaluation (55%) was the most common reason in women, in the current study population. The most frequent physical status classification was ASA III (32%) (Table 1). Median (IQR) CPET- $VO_{2peak}$  was 27.6 (17.0–40.0)  $ml \cdot kg^{-1} \cdot min^{-1}$  for men, and 19.5 (16.0–26.6)  $ml \cdot kg^{-1} \cdot min^{-1}$  for women, reflecting on average 91% and 100% of the reference value for healthy Dutch males and females, respectively [45].

The AUC of the FitMáx was significantly higher compared to the DASI, MET-questionnaire, and the M-DASI-4Q for the included thresholds, in the total study population (Fig. 1a-c). An AUC of 0.93 (0.90–0.95), 0.93 (0.90–0.95), and 0.97 (0.95–0.99) was found to detect patients at risk based on the  $VO_{2peak} \leq 16.0$ ,  $\leq 18.2$ , and  $\leq 24.5$   $ml \cdot kg^{-1} \cdot min^{-1}$ , respectively. The AUC of the FitMáx was not significantly different compared to the VSAQ, except for the predefined  $VO_{2peak}$  threshold of  $\leq 24.5$   $ml \cdot kg^{-1} \cdot min^{-1}$ , in which a statistically significant difference was found.

The FitMáx cut-off values corresponding to the maximal value of the Youden index, obtained high sensitivity

**Table 1** Participant baseline characteristics

Variable	Total (100%, n = 361)	Male (77%, n = 277)	Female (23%, n = 84)
n			
<i>Anthropometrical data</i>			
Age (years) *	61 [51–70]	61 [52–70]	58 [46–68]
Body height (cm) *	176 [169–183]	179 [174–184]	165 [161–171]
Body mass (kg) *	81 [72–92]	83 [76–93]	71 [61–83]
BMI (kg·m <sup>-2</sup> )	25.9 [23.6–29.0]	25.8 [23.9–28.9]	26.0 [22.1–29.1]
FEV <sub>1</sub> (L) *	3.24 [2.36–3.95]	3.49 [2.70–4.11]	2.25 [1.71–2.97]
FVC (L) *	4.10 [3.18–4.96]	4.44 [3.63–5.10]	2.91 [2.40–3.66]
COPD, GOLD classification			
None	325 (90%)	250 (90%)	75 (89%)
GOLD I	5 (1%)	3 (1%)	2 (2%)
GOLD II	17 (5%)	12 (4%)	5 (6%)
GOLD III	11 (3%)	10 (4%)	1 (1%)
GOLD IV	3 (1%)	2 (1%)	1 (1%)
Use of β-blocker			
Yes *	115 (32%)	97 (35%)	18 (21%)
No	246 (68%)	180 (65%)	66 (79%)
ASA-Classification *			
Missing	54 (15%)	48 (17%)	6 (7%)
I	66 (18%)	45 (16%)	21 (25%)
II	85 (24%)	59 (21%)	26 (31%)
III	117 (32%)	89 (32%)	28 (33%)
IV	39 (11%)	36 (13%)	3 (4%)
Reason CPET *			
Health check-up	59 (16%)	50 (18%)	9 (11%)
Cardiac evaluation *	183 (51%)	160 (58%)	23 (27%)
Pulmonary evaluation *	103 (29%)	57 (21%)	46 (55%)
Oncologic rehabilitation	16 (4%)	10 (4%)	6 (7%)
<i>CPET data</i>			
VO <sub>2peak</sub> (ml·kg <sup>-1</sup> ·min <sup>-1</sup> ) *	25.3 [17.2–38.4]	27.6 [17.0–40.0]	19.5 [16.0–26.6]
WR <sub>peak</sub> (W) *	176 [102–285]	208 [113–315]	108 [80–160]
HR <sub>peak</sub> (beats·min <sup>-1</sup> )	155 [131–171]	157 [131–171]	153 [131–169]
RER <sub>peak</sub>	1.14 [1.08–1.20]	1.15 [1.09–1.21]	1.12 [1.07–1.18]
Exercise time (min)	9.3 [8.2–10.4]	9.4 [8.4–10.4]	8.9 [7.6–10.4]
VO <sub>2peak</sub> reference <sup>a</sup> (ml·kg <sup>-1</sup> ·min <sup>-1</sup> ) *	29.9 [24.8–34.6]	31.5 [27.5–35.2]	22.6 [17.6–28.0]
% of the reference VO <sub>2peak</sub> *	92.9 [69.0–116.3]	91.4 [65.6–116.3]	99.5 [77.4–115.6]
<i>Questionnaire data</i>			
Time between CPET and questionnaires (days)	0 [–5–0]	0 [–6–0]	0 [–1–0]
FitMáx-VO <sub>2peak</sub> (ml·kg <sup>-1</sup> ·min <sup>-1</sup> ) *	25.1 [18.6–38.3]	30.1 [19.1–39.5]	20.9 [15.8–27.4]
DASI-VO <sub>2peak</sub> (ml·kg <sup>-1</sup> ·min <sup>-1</sup> ) *	31.2 [21.9–34.6] **	31.4 [22.2–34.6]**	25.4 [19.6–32.0]
VSAQ-VO <sub>2peak</sub> (ml·kg <sup>-1</sup> ·min <sup>-1</sup> ) *	22.4 [15.1–36.9] **	29.0 [15.7–37.3]**	18.6 [14.2–22.7]**
MET questionnaire-VO <sub>2peak</sub> (ml·kg <sup>-1</sup> ·min <sup>-1</sup> ) *	24.5 [14.0–28.0] **	24.5 [17.5–35.0]**	21.0 [14.0–24.5]
M-DASI-4Q *	3 [1–4]	3 [2–4]	2 [1–4]

Results are displayed as n (%) or median [IQR]

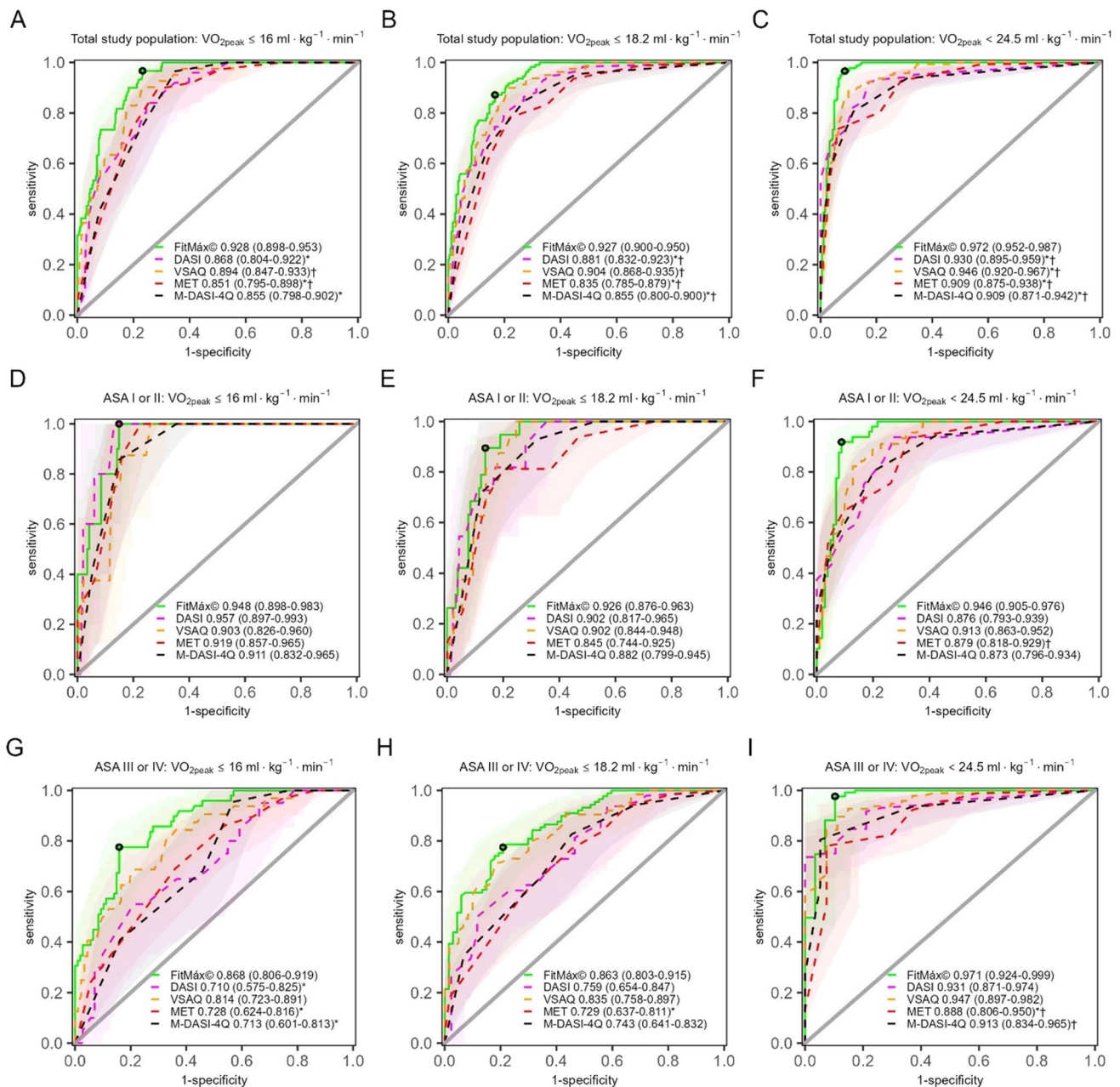
Missing information, number of subjects: FEV<sub>1</sub>, 2; FVC, 2; DASI-VO<sub>2peak</sub>, 120; VSAQ-VO<sub>2peak</sub>, 39; MET questionnaire-VO<sub>2peak</sub>, 50

\* Significantly different between female and male subjects. In case of categorical values, a post hoc analysis with Bonferroni correction for multiple testing was performed

\*\* Significantly different from CPET

<sup>a</sup>The prediction model for VO<sub>2peak</sub> of the LowLands Fitness Registry was used as a reference value[45]

Abbreviations: ASA, American Society of Anesthesiologists physical status; BMI, body mass index; COPD, chronic obstructive pulmonary disease; CPET, cardiopulmonary exercise testing; DASI, duke activity status index; FEV<sub>1</sub>, forced expiratory volume in 1 s; FVC, forced vital capacity; GOLD, Global initiative for chronic Obstructive Lung Disease; HR<sub>peak</sub>, heart rate at peak exercise; M-DASI-4Q, modified 4-question duke activity status index; MET, metabolic equivalent of task; RER<sub>peak</sub>, respiratory exchange ratio at peak exercise; VO<sub>2peak</sub>, oxygen uptake at peak exercise; VSAQ, veterans-specific activity questionnaire; WR<sub>peak</sub>, work rate at peak exercise



**Fig. 1** ROC curves for detecting predefined  $VO_{2peak}$  thresholds with patient-reported questionnaires. **Notes:** AUC is reported with 95% CI. Graphs a-c: ROC curves to detect  $VO_{2peak} \leq 16.0, \leq 18.2$  and  $\leq 24.5 \text{ ml} \cdot \text{kg}^{-1} \cdot \text{min}^{-1}$  in the total study population ( $n=361$ ). Graphs d-f: ROC curves to detect  $VO_{2peak} \leq 16.0, \leq 18.2$  and  $\leq 24.5 \text{ ml} \cdot \text{kg}^{-1} \cdot \text{min}^{-1}$  in a subgroup with ASA I-II ( $n=151$ ).

Graphs g-i: ROC curves to detect  $VO_{2peak} \leq 16.0, \leq 18.2$  and  $\leq 24.5 \text{ ml} \cdot \text{kg}^{-1} \cdot \text{min}^{-1}$  in a subgroup with ASA III-IV ( $n=156$ ). ° Youden index of the FitMáx. \* Significant different AUC compared to the FitMáx (complete case analysis). † Significant different Youden J-statistic compared to the FitMáx (complete case analysis)

(> 87%), and high negative predictive values (NPV > 90%) across all predefined values of the CPET- $VO_{2peak}$  thresholds (Table 2) [36]. The FitMáx cut-off value corresponding to the  $VO_{2peak}$  threshold  $\leq 24.5 \text{ ml} \cdot \text{kg}^{-1} \cdot \text{min}^{-1}$ , with highest specificity and positive predictive value (PPV), was  $26.1 \text{ ml} \cdot \text{kg}^{-1} \cdot \text{min}^{-1}$ . Using this cut-off, the FitMáx achieved a sensitivity of 97%, specificity of 91%, PPV of 91%, and

NPV of 97%. The corresponding cut-off value for VSAQ was  $20.4 \text{ ml} \cdot \text{kg}^{-1} \cdot \text{min}^{-1}$ , with a sensitivity of 89%, specificity of 90%, PPV of 88%, and NPV of 92%, which are slightly lower compared to the FitMáx. The analogous optimal cut-off value of the DASI was  $29.2 \text{ ml} \cdot \text{kg}^{-1} \cdot \text{min}^{-1}$ , and resulted in a sensitivity of 92%, specificity of 82%, PPV of 81%, and NPV of 93%, which are lower compared to both FitMáx

**Table 2** Questionnaire cut-off values to detect a  $VO_{2peak} \leq 16.0, \leq 18.2$  and  $\leq 24.5$   $ml \cdot kg^{-1} \cdot min^{-1}$  based on Youden index in the total study population ( $n = 361$ )

Questionnaire and predefined $VO_{2peak}$ threshold	Questionnaire Cut-off value	Sensitivity	Specificity	PPV	NPV
<b>FitMáx</b>					
$\leq 16.0$ $ml \cdot kg^{-1} \cdot min^{-1}$	20.6 $ml \cdot kg^{-1} \cdot min^{-1}$	0.97	0.77	0.45	0.99
$\leq 18.2$ $ml \cdot kg^{-1} \cdot min^{-1}$	21.3 $ml \cdot kg^{-1} \cdot min^{-1}$	0.87	0.83	0.69	0.94
$\leq 24.5$ $ml \cdot kg^{-1} \cdot min^{-1}$	26.1 $ml \cdot kg^{-1} \cdot min^{-1}$	0.97	0.91	0.91	0.97
<b>DASI</b>					
$\leq 16.0$ $ml \cdot kg^{-1} \cdot min^{-1}$	22.9 $ml \cdot kg^{-1} \cdot min^{-1}$	0.84	0.75	0.28	0.98
$\leq 18.2$ $ml \cdot kg^{-1} \cdot min^{-1}$	24.1 $ml \cdot kg^{-1} \cdot min^{-1}$	0.80	0.80	0.57	0.92
$\leq 24.5$ $ml \cdot kg^{-1} \cdot min^{-1}$	29.2 $ml \cdot kg^{-1} \cdot min^{-1}$	0.92	0.82	0.81	0.93
<b>M-DASI-4Q</b>					
$\leq 16.0$ $ml \cdot kg^{-1} \cdot min^{-1}$	2.0 <sup>a</sup>	0.97	0.65	0.26	0.99
$\leq 18.2$ $ml \cdot kg^{-1} \cdot min^{-1}$	2.0 <sup>a</sup>	0.85	0.73	0.52	0.93
$\leq 24.5$ $ml \cdot kg^{-1} \cdot min^{-1}$	2.0 <sup>a</sup>	0.81	0.88	0.84	0.85
<b>VSAQ</b>					
$\leq 16.0$ $ml \cdot kg^{-1} \cdot min^{-1}$	16.3 $ml \cdot kg^{-1} \cdot min^{-1}$	0.90	0.77	0.36	0.98
$\leq 18.2$ $ml \cdot kg^{-1} \cdot min^{-1}$	18.2 $ml \cdot kg^{-1} \cdot min^{-1}$	0.90	0.79	0.59	0.96
$\leq 24.5$ $ml \cdot kg^{-1} \cdot min^{-1}$	20.4 $ml \cdot kg^{-1} \cdot min^{-1}$	0.89	0.90	0.88	0.92
<b>MET questionnaire</b>					
$\leq 16.0$ $ml \cdot kg^{-1} \cdot min^{-1}$	17.5 $ml \cdot kg^{-1} \cdot min^{-1}$	0.89	0.71	0.30	0.98
$\leq 18.2$ $ml \cdot kg^{-1} \cdot min^{-1}$	17.5 $ml \cdot kg^{-1} \cdot min^{-1}$	0.78	0.78	0.54	0.91
$\leq 24.5$ $ml \cdot kg^{-1} \cdot min^{-1}$	17.5 $ml \cdot kg^{-1} \cdot min^{-1}$	0.74	0.94	0.90	0.82

<sup>a</sup> Predefined  $VO_{2peak}$  thresholds and Questionnaire cut-off values are expressed in  $ml \cdot kg^{-1} \cdot min^{-1}$  except for the M-DASI-4Q

Abbreviations: DASI, duke activity status index; M-DSAI-4Q, modified 4-question duke activity status index; MET, metabolic equivalent of task; NPV, negative predictive value; PPV, positive predictive value;  $VO_{2peak}$ , oxygen uptake at peak exercise; VSAQ, veterans-specific activity questionnaire

and VSAQ. These results were generally the same for the VSAQ and DASI in relation to the FitMáx for the two other  $VO_{2peak}$  thresholds (i.e.,  $\leq 18.2$  and  $\leq 24.5$   $ml \cdot kg^{-1} \cdot min^{-1}$ ) (Table 2). For the MET-questionnaire and the M-DASI-4Q, the cut-off values of 17.5  $ml \cdot kg^{-1} \cdot min^{-1}$  and 2.0 (on a scale 1–4) were found (due to the nature of these questionnaires), corresponding to all three predefined  $VO_{2peak}$  thresholds.

Table 3 presents FitMáx cut-off values corresponding to the predefined  $VO_{2peak}$  thresholds for predetermined sensitivity values. This enables clinicians to select the most suitable FitMáx- $VO_{2peak}$  cut-off values in specific clinical situations.

The subgroup analysis based on ASA physical status classification consisted of 151 participants (104 men and 47 women) with ASA I-II, and a median (IQR)  $VO_{2peak}$  of 34.3 (27.1–42.7)  $ml \cdot kg^{-1} \cdot min^{-1}$  and 22.5 (18.7–27.0)  $ml \cdot kg^{-1} \cdot min^{-1}$ , for men and women respectively. The subgroup of ASA III-IV consisted of 156 participants (125 men and 31 women), with a median (IQR)  $VO_{2peak}$  of 17.8 (16.0–23.7)  $ml \cdot kg^{-1} \cdot min^{-1}$  and 16.2 (13.6–18.0)  $ml \cdot kg^{-1} \cdot min^{-1}$ , for men and women respectively.

AUC values of the questionnaires did not show a significant difference, when compared pairwise to the FitMáx in the subgroup with ASA I-II (Fig. 1d-f). In the subgroup with ASA III-IV, FitMáx showed a significantly higher AUC compared

to the DASI, MET-questionnaire, and M-DASI-4Q for the  $VO_{2peak}$  threshold  $\leq 16.0$   $ml \cdot kg^{-1} \cdot min^{-1}$ . The AUC for the FitMáx was not significantly different compared to the VSAQ (Fig. 1g). For the  $VO_{2peak}$  thresholds of  $\leq 18.2$  and  $\leq 24.5$  the AUC of the FitMáx showed only a significant difference when compared to the MET-questionnaire (Fig. 1h-i). As expected, the 95% CI are larger in the subgroup analyses compared to the total study population (Fig. 1).

For the subgroup with ASA III-IV, different optimal questionnaire cut-off values were found based on the Youden index, compared to the total study population (supplementary Table 1). For the FitMáx and DASI, the optimal cut-off values are closer to the predefined  $VO_{2peak}$  thresholds compared to the other questionnaires. For the VSAQ, the optimal cut-off values are lower compared to the predefined  $VO_{2peak}$  thresholds. The M-DASI-4Q and the MET-questionnaire showed the same cut-off value as in the total study population, except for the MET-questionnaire on the  $VO_{2peak}$  threshold of  $\leq 16.0$   $ml \cdot kg^{-1} \cdot min^{-1}$ , for which a cut-off value of 14.0  $ml \cdot kg^{-1} \cdot min^{-1}$  was found. Overall, in the subgroup with ASA III-IV, lower sensitivity values and NPV were found for all questionnaires to distinguish patients at risk. On the other hand, specificity and PPV were generally higher in the ASA III-IV subgroup, compared to the

**Table 3** Cut-off values for the FitMáx to detect a  $VO_{2peak} \leq 16.0, \leq 18.2$  and  $\leq 24.5$   $ml \cdot kg^{-1} \cdot min^{-1}$  based on sensitivity values in total study population ( $n = 361$ )

Sensitivity	$VO_{2peak} \leq 16.0$ $ml \cdot kg^{-1} \cdot min^{-1}$				$VO_{2peak} \leq 18.2$ $ml \cdot kg^{-1} \cdot min^{-1}$				$VO_{2peak} \leq 24.5$ $ml \cdot kg^{-1} \cdot min^{-1}$			
	FitMáx $VO_{2peak}$ cut-off value ( $ml \cdot kg^{-1} \cdot min^{-1}$ )	Specificity	PPV	NPV	FitMáx $VO_{2peak}$ cut-off value ( $ml \cdot kg^{-1} \cdot min^{-1}$ )	Specificity	PPV	NPV	FitMáx $VO_{2peak}$ cut-off value ( $ml \cdot kg^{-1} \cdot min^{-1}$ )	Specificity	PPV	NPV
0.05	10.3	1.00	1.00	0.84	10.8	1.00	1.00	0.71	11.5	1.00	1.00	0.52
0.10	10.8	1.00	1.00	0.85	12.1	1.00	1.00	0.72	13.1	1.00	1.00	0.54
0.15	11.5	1.00	1.00	0.86	12.9	1.00	1.00	0.73	14.7	1.00	1.00	0.55
0.20	12.1	1.00	1.00	0.86	13.4	1.00	1.00	0.74	15.6	0.99	0.97	0.56
0.25	12.7	1.00	1.00	0.87	15.0	0.99	0.91	0.76	16.0	0.99	0.96	0.58
0.30	12.9	1.00	1.00	0.88	15.6	0.99	0.92	0.77	16.4	0.99	0.96	0.60
0.35	14.3	0.99	0.88	0.88	15.8	0.98	0.91	0.78	17.0	0.99	0.97	0.61
0.40	15.1	0.97	0.73	0.89	16.2	0.97	0.87	0.79	17.8	0.99	0.97	0.63
0.45	15.6	0.96	0.69	0.90	16.4	0.97	0.88	0.81	18.5	0.98	0.95	0.65
0.50	15.8	0.95	0.68	0.91	17.0	0.96	0.86	0.82	18.9	0.98	0.96	0.67
0.55	16.3	0.93	0.62	0.91	17.5	0.96	0.86	0.83	19.2	0.98	0.96	0.70
0.60	16.4	0.93	0.63	0.92	18.6	0.92	0.76	0.84	19.7	0.97	0.96	0.72
0.65	16.8	0.92	0.63	0.93	18.7	0.92	0.77	0.86	20.1	0.97	0.95	0.74
0.70	17.1	0.92	0.64	0.94	19.1	0.91	0.77	0.88	21.0	0.96	0.94	0.77
0.75	18.6	0.86	0.53	0.95	19.4	0.90	0.77	0.89	21.7	0.95	0.94	0.80
0.80	18.7	0.86	0.53	0.96	20.4	0.85	0.71	0.92	22.3	0.95	0.94	0.83
0.85	19.1	0.83	0.50	0.97	21.2	0.83	0.69	0.93	22.9	0.95	0.94	0.87
0.90	19.5	0.82	0.50	0.98	22.3	0.79	0.66	0.95	23.8	0.94	0.94	0.91
0.95	20.4	0.77	0.45	0.99	24.3	0.72	0.60	0.98	25.3	0.92	0.92	0.96
1.00	22.3	0.70	0.40	1.00	27.6	0.67	0.57	1.00	30.0	0.85	0.87	1.00

Predefined  $VO_{2peak}$  thresholds and FitMáx cut-off values are expressed in  $ml \cdot kg^{-1} \cdot min^{-1}$

Abbreviations: NPV, negative predictive value; PPV, positive predictive value;  $VO_{2peak}$ , oxygen uptake at peak exercise

total study population. To reach a predetermined sensitivity of 90%, cut-off values for the FitMáx were 19.3, 22.2, and 23.4 ml·kg<sup>-1</sup>·min<sup>-1</sup> corresponding to VO<sub>2peak</sub> thresholds of ≤ 16.0, ≤ 18.2, and ≤ 24.5 ml·kg<sup>-1</sup>·min<sup>-1</sup>, respectively.

## Discussion

The current study investigated whether self-reported questionnaires could be used in the preoperative evaluation to identify high-risk surgical patients, using predefined clinically relevant VO<sub>2peak</sub> thresholds corresponding to a higher risk for complications. Overall, all questionnaires demonstrated good ability to identify patients at high preoperative risk (with the VO<sub>2peak</sub> thresholds as standard criterion) in the current study population [46]. However, differences in sensitivity, specificity, NPV, and PPV exist and should be taken into account in specific clinical situations. Not all questionnaires may be suitable in clinical practice, since their cut-off values may lead to many false positive outcomes, and patients may be referred for additional exercise testing or preventive measures unnecessarily. The FitMáx and VSAQ performed superiorly compared to the DASI, M-DASI-4Q, and MET questionnaire. In previous studies, DASI, VSAQ and FitMáx have shown to diverge in performance (correlation, bias and 95% limits of agreement) in predicting CPET-VO<sub>2peak</sub> in several study populations [12, 23, 25, 28–31]. Struthers et al. reported poor discriminative ability of the DASI between patients with higher and lower preoperative risk, which may be caused by the relatively low mean VO<sub>2peak</sub> of 18.7 ml·kg<sup>-1</sup>·min<sup>-1</sup> in their study population [29]. Wijesundera et al. reported that subjective assessment with a MET categorization failed to detect low CRF in a study population with a mean VO<sub>2peak</sub> of 19.2 ml·kg<sup>-1</sup>·min<sup>-1</sup> and a small range in VO<sub>2peak</sub> [12]. The small range in VO<sub>2peak</sub> is mostly due to a higher mean age and considerably less healthy participants in the study groups as opposed to the current study (median VO<sub>2peak</sub> of 25.3 ml·kg<sup>-1</sup>·min<sup>-1</sup>) [12, 29]. Possibly, the presence of more fit subjects in a population enlarges the discriminative ability of questionnaires to detect subjects with lower CRF and concomitant higher preoperative risk for complications [2–4]. A lower discriminative ability of questionnaires to identify patients with low CRF, is also found in the current study in the subgroup with ASA III-IV.

In this study, AUC values to classify subjects based on VO<sub>2peak</sub> thresholds were highest for the FitMáx for all three considered VO<sub>2peak</sub> thresholds in the total study population and in the subgroups based on the ASA classification. However, the AUC values of the FitMáx were not always *significantly* higher compared to the other questionnaires. Also, optimal questionnaire cut-off values based on the Youden index were presented. However, the Youden index

does not distinguish between the importance of sensitivity versus specificity in clinical situations [36]. Therefore, an additional analysis based on predetermined sensitivity values was performed [38]. To reach a sensitivity of 90%, the FitMáx cut-off values of 19.5, 22.3, and 23.8 ml·kg<sup>-1</sup>·min<sup>-1</sup> were found in correspondence with VO<sub>2peak</sub> thresholds of ≤ 16.0, ≤ 18.2 and ≤ 24.5 ml·kg<sup>-1</sup>·min<sup>-1</sup>, respectively. Depending on the VO<sub>2peak</sub> threshold that is used in clinical practice, preoperative CPET may be unnecessary for patients with VO<sub>2peak</sub> estimated from the FitMáx questionnaire above these cut-off values, unless an underlying cardiac or pulmonary exercise limitation is suspected.

Subgroup analyses based on ASA classification showed comparable AUC values for ASA I-II, and lower AUC values with wider 95%-CI for ASA III-IV to detect the predefined VO<sub>2peak</sub> thresholds, compared to the total study population [46]. As described earlier, this leads to the assumption that the discriminative ability of the questionnaires is lower in a population with lower mean CRF [29]. Based on the sensitivity analysis in the ASA III-IV subgroup, the same FitMáx cut-off value was found to detect VO<sub>2peak</sub> ≤ 18.2 ml·kg<sup>-1</sup>·min<sup>-1</sup>, and slightly different cut-off values were found to detect VO<sub>2peak</sub> ≤ 16.0 and ≤ 24.5 ml·kg<sup>-1</sup>·min<sup>-1</sup>, compared to the total study population. However, specificity and PPV are lower compared to the total study population, indicating more false-positive and less true-positives cases. This means being classified as less fit because of a low FitMáx-VO<sub>2peak</sub>, in the ASA III-IV subgroup, does not necessarily mean a person is truly less fit [37].

Remarkably, the optimal cut-off values of the MET-questionnaire based on the Youden index are the same for all predefined VO<sub>2peak</sub> thresholds, except for the cut-off value corresponding to the threshold VO<sub>2peak</sub> ≤ 16.0 ml·kg<sup>-1</sup>·min<sup>-1</sup> in the ASA III-IV subgroup [36]. The cut-off value of VO<sub>2peak</sub> ≤ 17.5 ml·kg<sup>-1</sup>·min<sup>-1</sup> corresponds to the METs cut-off value of 7, as suggested by the American Heart Association [17]. Based on the Youden index, the M-DASI-4Q only showed one possible cut-off value of 2.0 (on a scale 1–4). This is probably due to the sole purpose of the questionnaire to provide a preoperative risk cut-off point [36]. Based on the current study results, it is recommended to use the FitMáx or VSAQ in preoperative screening to distinguish patients at a higher risk based on predefined VO<sub>2peak</sub> thresholds. However, these self-reported questionnaires do not take patients' comorbidities into account. It is therefore advised to combine subjective assessment by anaesthesiologists/physicians with the questionnaire-predicted CRF to enable informed decision-making [11]. Patients with a poor result (predicted VO<sub>2peak</sub> ≤ 21.3 and ≤ 18.2 ml·kg<sup>-1</sup>·min<sup>-1</sup> respectively for FitMáx and VSAQ) could benefit from further preoperative (cardiopulmonary) exercise testing and preventive interventions (e.g., prehabilitation).



## Study limitations and implications for future research

The main limitation of the current study is that data was used from a cohort of participants recruited in a general clinical setting instead of a specific preoperative setting. Although ASA III was the most common physical status classification in the current study population, indicating patients with severe systemic diseases [11], one might question to which extent results can be extrapolated to a preoperative population, since postoperative follow-up was not possible. Future studies should focus on the direct relationship of questionnaire-estimated preoperative  $VO_{2peak}$  with peri- and postoperative outcomes (e.g. length of hospitalization, complications, mortality) in a surgical study population to validate the role of questionnaires in preoperative risk screening and/or assessment. Moreover, the current study population consisted of mainly male subjects (77%). A recent study reported a sex-specific difference in  $VO_{2peak}$  thresholds for predicting postoperative complications [47]. To enhance the interpretability for female subjects, more data should be collected to evaluate the accuracy of detecting sex-specific  $VO_{2peak}$  thresholds. A limitation of the questionnaires is the inclusion of activities that are not globally practiced (e.g. cycling, basketball, skiing) [22, 27]. However, in the previous validation study, the predicted  $VO_{2peak}$  based on the FitMáx without cycling showed similar results compared to the FitMáx with cycling [22].

## Conclusion

The FitMáx, DAS1, M-DASI-4Q, VSAQ, and MET questionnaire all showed high AUC values in a general Dutch population to preoperatively identify patients at high risk, in which the FitMáx and VSAQ performed superiorly. Both could be used as self-reported questionnaires to identify high-risk surgical patients who might benefit from formal preoperative (cardiopulmonary) exercise testing and preoperative interventions to reduce surgical risks.

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**Data availability** More information on the data gathered and the analysis used is available upon reasonable request.

## Declarations

**Ethics approval** All procedures performed in studies involving human participants were in accordance with the ethical standards of the institutional and/or national research committee and with the 1964 Helsinki Declaration and its later amendments or comparable ethical standards. Ethical approval for this study (reference number N18.051) was provided by the authorised Medical Research Ethics Committee of the MMC, Veldhoven, the Netherlands on 30 April 2018. Informed consent for participation was obtained from all individual participants included in the study.

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

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