# Preliminary stock assessment of Indian Ocean yellowfin tuna using Statistical-Catch-At-Size (SCAS) (1950-2020) ${ }^{1}$ 

October 2021<br>Tom Nishida ${ }^{1 /}$ and Toshihide Kitakado ${ }^{2 /}$<br>1/ Fisheries Resources Institute, Japan Fisheries Research and Education Agency,<br>Shizuoka, Japan (aco20320@par.odn.ne.jp)<br>2/ Tokyo University of Marine Science and Technology, Tokyo, Japan


#### Abstract

- We conducted preliminary yellowfin tuna stock assessments (1950-2020) using the SCAS software(Nishida et al)(2021). The primary objective of our assessments is to evaluate the current YFT stock status (2020) as a reference for SS3. - Major differences between SCAS vs. SS3 are the time unit (annual vs. quarter) and tagging data (without vs. with). Other input information is nearly identical. - We investigated the current stock status (in 2020) using wide ranges of grids by combining 6 factors, i.e., (a) 2 types of area models, i.e., whole (one) area (9 fleets) model and 4 sub-areas ( 21 fleets) model, (b) 3 types of CPUE, i.e., LL (longline), PSA (Purse Seine Adult) and PSJ (Purse Seine Juvenile), (c) 3 steepness values (0.7, 0.8 and 0.9 ), ( $d$ ) 3 values for $\sigma$ for the recruitment deviation ( $0.4,0.6$ and 0.8 ) and (e) 2 values for the likelihood weighting for CAS ( 0.1 and 0.01 ). The total number of grids is 108 , i.e., 54 each for the whole area ( 9 fleets) model and the 4 sub-areas ( 21 fleets) model. - Only 9 girds out of 108 produced convergences, i.e., 3 for the whole area model and 6 for the 4 areas model. Even numbers ( 9 grids) are small, this implies that 4 areas ( 21 fleets) model is likely more plausible. - The representative result (the median point of 9 grids) suggested that YFT stock status in 2020 is the overfished and overfishing situation ( $\mathrm{TB}_{2020} / \mathrm{TBmsy}=0.74$ and $\mathrm{F}_{2020} / \mathrm{Fmsy}=1.84$ ). - However, we consider that $\mathrm{F}_{2020} / \mathrm{Fmsy}=1.84$ is implausible under the current situation. Thus, the results should be looked with a caution.


## Contents

1. Introduction ------------------------------------02
2. INPUT INFORMATION ---------------------------------03--08
3. Grid search---------------------------------------------09
4. Results ------------------------------------------------09-12
5. Discussion ------------------------------------------13

Acknowledgements -----------------------------------14
References ----------------------------------------------- 14
Appendix A Results of the median point---------15-22

[^0]
## 1. Introduction

In WPTT20(2018), yellowfin tuna stock assessment was conducted by Stock Synthesis (SS3) and the stock status and management advice were provided. In addition, Statistical-Catch-At-Age (SCAA) was also conducted as a reference (supporting information). Due to large uncertainties in Kobe II Strategic Risk Matrix in SS3, no concrete management advices could be provided. To overcome this problem, WPTT21(2019), WPTT22(2020) and WPTT23(DP) (May 2021) discussed details to improve the situation by making number of suggestions. By incorporating these suggestions, SS3 was conducted with new information in WPTT23 by Fu et al (IOTC-2021-WPTT23-12).

During the WPTT23(DP), it was noted that other models (ASPIC, JABBA and SCAS) plan to be implemented as references and results will be compared with SS3 in this WPTT23(2021) meeting. Such comparisons among different models with different specifications may be useful to some extent to evaluate the results of SS3.

As mentioned above, SCAA was used in 2018. However, for this time, SCAS was used as the preferable model to SCAA because estimated CAA in SCAA includes biases and uncertainties (Nishida et al 2018). Thus, it is more appropriate to apply SCAS using raw size frequency data by avoiding such biases and uncertainties. SCAS is a simpler model of SS3.

Two major different specifications between SCAS and SS3 are (a) SCAS is the annual basis model, while SS3 is quarterly based, and (b) SCAS does not use the tagging data (no spatial components), while SS3 does. Thus, results of SCAS are more comparable to SS3 than ASPIC and JABBA based on only catch and CPUE. In addition, we developed the menu driven SCAS software and applied to this YFT stock assessment. For details of the SCAS software, refer to the other information document (IOTC-WPTT23-INFO3).

We tried to use the same input information as in SS3 (2018 and 2021) as much as possible for meaningful comparisons.

## 2. INPUT INFORMATION

In this section, we briefly describe input information for SCAS runs. For detail description of the input information, refer to the SS3 document by Fu et al (IOTC-2021-WPTT23-12).
2.1 Assumption of the stock structure and definition of sub areas.

We assume that yellowfin tuna in the Indian Ocean is one single stock. As in SS3, we use four sub-areas (R1-R4), where R1 has two divisions (R1a and R1b) (Fig. 1).


Fig. 1 Four sub-areas in the Indian Ocean for YFT stock assessment defined by SS3 under the single stock structure hypothesis

### 2.2 Definition of fleets and catch trend by fleet

We set up 2 area models, (a) one (whole) with 9 fleets and (b) 4 sub-areas with 21 fleet as in SS3. The 4 sub areas model is the same as in SS3 (Fu et al, 2021). We used nominal catch from the published data (IOTC-2021-WPTT23(AS)-DATA03). Table 1 and 2 defines the fleet types and Figs.2-3 for annual catch trends by fleet for the one area model and the 4 sub areas models, respectively.

Table 1 Definition of 9 fleets used in the one (whole) area model

| fleet \# | gear type | code |
| :---: | :---: | :---: |
| f1 | Pole and Line | BB |
| f2 | Troll | TR |
| f3 | Purse seine (Log school) | LS |
| f4 | Others | OT |
| f5 | Gillnet | GL |
| f6 | Purse seine (Free school) | FS |
| f7 | Handline | HD |
| f8 | Longline (Fresh) | LF |
| f9 | Longline (Frozen) | LL |



Fig. 2 Catch of 9 fleets in the one (whole) area model.

Table 2 Definition of 21 fleets used in the 4 sub-areas model

| fleet \# | area | gear type | code |
| :---: | :---: | :---: | :---: |
| f1 | 1 | Gillnet | 1_GI_1a |
| f2 | 1 | Handline | 2_HD_1a |
| f3 | 1 | Longline (Frozen) | 3_LL_1a |
| f4 | 1 | Others | 4_OT_1a |
| f5 | 1 | Pole and Line | 5_BB_1b |
| f6 | 1 | Purse seine (Free school) | 6_FS_1b |
| f7 | 1 | Longline (Frozen) | 7_LL_1b |
| $f 8$ | 1 | Purse seine (Log school) | 8_LS_1b |
| f9 | 1 | Troll | 9_TR_1b |
| $f 10$ | 2 | Longline (Frozen) | 10_LL_2 |
| $f 11$ | 3 | Longline (Frozen) | 11_LL_3 |
| $f 12$ | 4 | Gillnet | 12_GI_4 |
| $f 13$ | 4 | Longline (frozen) | 13_LL_4 |
| f14 | 4 | Others | 14_OT_4 |
| $f 15$ | 4 | Troll | 15_TR_4 |
| $f 16$ | 2 | Purse seine (Free school) | 16_FS_2 |
| $f 17$ | 2 | Purse seine (Log school) | 17_LS_2 |
| $f 18$ | 2 | Troll | 18_TR_2 |
| $f 19$ | 4 | Purse seine (Free school) | 19_FS_4 |
| f20 | 4 | Purse seine (Log school) | 20_LS_4 |
| f21 | 4 | Longline (Fresh) | 21_LF_4 |



Fig. 3 Catch of 21 fleets used in the 4 sub-areas model

### 2.4 Standardized CPUE

Three types of standardized CPUE are available and published in the IOTC home page (IOTC-2021-WPTT23(AS)-DATA15-CPUE), i.e., Longline (1975-2020) by Kitakado et al (IOTC-2021-WPTT23(AS)-11), Purse seine (adult) (1991-20219) and Purse seine (juvenile) (1991-2018) by Guéry et al (IOTC-2021-WPTT23(AS)-10). Two outliers (2010 and 2018) in the PS (juvenile) CPUE were removed. Figs. 4 and 5 shows the trends of 3 CPUE for one area model and 4 sub-areas model respectively.




Fig. 4 Annual trends of three types of standardized CPUE used for the one area model (top: LL, middle: PS-adult and bottom: PS-juvenile)


Fig. 5 Annual trends of standardized LL CPUE by area used for the 4 areas model

### 2.5 Biological information (Table 3)

Table 3 Summary on the biological input information to the SCAS.

| Type | Input information to SCAS (annual based) | Sources |
| :---: | :---: | :---: |
| Size | $10-198 \mathrm{~cm}$ ( 4 cm class interval) by fleet <br> For the one area ( 9 fleets) model, data for 9 fleets are available. <br> For the 4 area ( 21 fleets) model, data for 19 fleets area available, while 2 TR fleets (9_TR_1b and 18_TR_2) are not available. | Secretariat IOTC-2021-WPTT23(AS)-DATA12 |
| Selectivity | LL and LF: Logistic model <br> Other fleets: Double normal model <br> (Note) As the cubic spline model is not available in the current SCAS software, the double normal model is substituted for PSLS, while SS3 used cubic spline model. | Fu et al (2018 \& 2021) YFT SS3 assessment |
| LW relation | $W=a L^{b}$ <br> where, $a=2.9667$ and $b=2.459 E-5$ | Secretariat IOTC-2016-WPDCS12-INF05 |
| Growth equation | Ad hoc 2 stanza model based on the tag recapture data. Approximated by the von Bertalanffy growth equation ( $\mathrm{Loo}=145 \mathrm{~cm}, \mathrm{tO}=0.024$ and $\mathrm{K}=0.438$ ). This is because the current SCAS software cannot handle this ad hoc model, | Fonteneau, A. 2008. A working proposal for a Yellowfin growth curve to be used during the 2008 yellowfin stock assessment (IOTC-2008-WPTT-4). |
| Maturity-at-age | Age 0 0 <br> Age 1 0.15 <br> Age 2 0.79 <br> Age 3 or older 1 | Zudair, I., Murua, H., Grande, M., Bodin, N. (2013). Reproductive potential of yellowfin tuna in the western Indian Ocean. Fish. Bull. 111:252-264. |
| M <br> (Natural mortality) | 0 1.20 <br> 1 0.54 <br> 2 0.54 <br> 3 0.76 <br> 4 0.74 <br> 5 0.58 <br> 6 0.54 <br> $7+$ 0.53 | Fu et al (2018). Mid-point between M based on tagging data (IOTC) and $M$ used by WCPFC. |

### 2.6 Summary of catch, standardized CPUE and size data (Table 4)

Table 4 Summary of nominal catch, standardized CPUE and size data

| Type | Fleet | Year | Authors | Source |
| :---: | :---: | :---: | :---: | :---: |
| Nominal catch | 9 fleets (one area model) <br> 21 fleets (4 area model) | $\begin{aligned} & 1950- \\ & 2020 \end{aligned}$ | Secretariat | - IOTC-2021-WPTT23(AS)-DATA03 |
| Standardized CPUE | Longline | $\begin{aligned} & 1975- \\ & 2020 \end{aligned}$ | Kitakado et al (2021) | $\bullet$ |
|  | Purse seine adult | $\begin{aligned} & 1991- \\ & 2019 \\ & \hline \end{aligned}$ | $\begin{aligned} & \text { Guéry et al } \\ & (2021) \end{aligned}$ |  |
| Size data | 9 fleets (one area model) <br> 21 fleets (4 area model) | $\begin{aligned} & 1950- \\ & 2020 \end{aligned}$ | Secretariat | - IOTC-2021-WPTT23(AS)-DATA11 <br> Size frequency data - YFT <br> - IOTC-2021-WPTT23(AS)-DATA12 <br> Size frequency data - reference file |

## 2 Grids search

To search an optimum set of parameters, we set up 108 grids combining 5 parameters described as below:
(a) 2 areas (whole area model with 9 fleets and 4 sub-areas model with 21 fleets)
(b) 3 different standardized CPUE (LL, PS for adult and PS for Juvenile)
(c) 3 different $\sigma$ for recruitment deviations ( $0.4,0.6$ and 0.8 )
(d) 3 different steepness ( $0.7,0.8$ and 0.9)
(e) 2 different weightings for CAS (0.01 and 0.1)

Table 5a and 5b (first 4 columns) shows the grid list. In addition, we used the initial guess population size (male and female combined) as 270 (age 0 ) and 75 million fish (age 1) and 5.5 million tons (age 0 biomass). Default values for the other parameters were used as described in the SCAS manual (OTC-WPTT23-INF03).

## 3. Results

Using the SCAS software (IOTC-WPTT23-INF03), we conducted the batch jobs for the 108 grids(runs) to search parameters converged. Table 5a and 5b shows results of the grid searches. Only 9 grids(runs) were converged. We selected the median point (grid \# A1-3 as the representative stock status in 2020 (Fig. 6). The result suggested that the stock status is overfished and overfishing situation, i.e., $\mathrm{TB}_{2020} / \mathrm{TBmsy}=0.74$ and $F_{2020} /$ Fmsy=1.84. Fig. 7 shows the Kobe plot, and Appendix 1 shows the results with some figures.

Table 5a Results the one area (9 fleets) model
(Note 1) Yellow makers indicate convergence (A and B), while no convergences, by "Warning - "in Error Message.
(Note 2) Pink markers indicate that parameters are out of range.

| CPUE | Run no. | CAS weight | $\begin{gathered} \text { Sigma } \\ (\text { SR) } \end{gathered}$ | h (steepness) | тво | TBmsy | $\begin{array}{\|c\|} \hline \text { TB } \\ \text { (current) } \end{array}$ | MSY | $\begin{array}{\|c\|} \hline \text { Catch } \\ \text { (current) } \end{array}$ | Depletion | TB/TBmsy | F/Fmsy | Error Message |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  | 1,000 tons |  |  |  |  |  |  |  |  |
| LL | A1-1 | 0.1 | 0.4 | 0.7 | >10,000 | >10,000 | 3,507 | <1 | 433 | 0.25 | 0.25 | 0.94 | Warning -- Hessian does not appear to be positive definite |
|  | A1-2 | 0.1 | 0.4 | 0.8 | > 10,000 | 4,319 | 3,321 | 609 | 433 | 0.28 | 0.77 | 1.59 | Warning -- Hessian does not appear to be positive definite |
|  | A1-3 | 0.1 | 0.4 | 0.9 | 8,324 | 3,285 | 2,445 | 474 | 433 | 0.29 | 0.74 | 1.84 | A |
|  | A1-4 | 0.1 | 0.6 | 0.7 | >10,000 | $>10,000$ | 5,077 | <1 | 433 | 0.36 | 0.36 | 0.39 | Warning -- Hessian does not appear to be positive definite |
|  | A1-5 | 0.1 | 0.6 | 0.8 | $>10,000$ | $>10,000$ | 5,978 | <1 | 433 | 0.35 | 0.35 | 0.91 | Warning -- Hessian does not appear to be positive definite |
|  | A1-6 | 0.1 | 0.6 | 0.9 | >10,000 | $>10,000$ | 8,014 | <1 | 433 | 0.46 | 0.46 | 0.22 | Warning -- Hessian does not appear to be positive definite |
|  | A1-7 | 0.1 | 0.8 | 0.7 | > 10,000 | $>10,000$ | 8,980 | 2,081 | 433 | 0.20 | 0.64 | 0.86 | Warning -- Hessian does not appear to be positive definite |
|  | A1-8 | 0.1 | 0.8 | 0.8 | $>10,000$ | $>10,000$ | > 10,000 | 3,207 | 433 | 0.18 | 0.76 | 0.77 | Warning -- Hessian does not appear to be positive definite |
|  | A1-9 | 0.1 | 0.8 | 0.9 | > 10,000 | $>10,000$ | 4,707 | <1 | 433 | 0.32 | 0.32 | 0.35 | Warning -- Hessian does not appear to be positive definite |
|  | A1-10 | 0.01 | 0.4 | 0.7 | 6,693 | 2,441 | 1,737 | 471 | 433 | 0.26 | 0.71 | 2.06 | B |
|  | A1-11 | 0.01 | 0.4 | 0.8 | 6,289 | 2,167 | 1,501 | 446 | 433 | 0.24 | 0.69 | 2.08 | Warning -- Hessian does not appear to be positive definite |
|  | A1-12 | 0.01 | 0.4 | 0.9 | > 10,000 | >10,000 | 2,724 | <1 | 433 | 0.27 | 0.27 | 1.26 | Warning -- Hessian does not appear to be positive definite |
|  | A1-13 | 0.01 | 0.6 | 0.7 | 7,880 | 2,900 | 1,875 | 555 | 433 | 0.24 | 0.65 | 2.22 | Warning -- Hessian does not appear to be positive definite |
|  | A1-14 | 0.01 | 0.6 | 0.8 | >10,000 | 4,044 | 2,649 | 704 | 433 | 0.22 | 0.65 | 1.71 | Warning -- Hessian does not appear to be positive definite |
|  | A1-15 | 0.01 | 0.6 | 0.9 | >10,000 | 5,060 | 4,809 | 1,395 | 433 | 0.20 | 0.95 | 1.01 | Warning -- Hessian does not appear to be positive definite |
|  | A1-16 | 0.01 | 0.8 | 0.7 | >10,000 | >10,000 | 2,045 | <1 | 433 | 0.20 | 0.20 | 1.02 | Warning -- Hessian does not appear to be positive definite |
|  | A1-17 | 0.01 | 0.8 | 0.8 | 9,366 | 3,259 | 1,897 | 649 | 433 | 0.20 | 0.58 | 1.87 | Warning -- Hessian does not appear to be positive definite |
|  | A1-18 | 0.01 | 0.8 | 0.9 | >10,000 | 5,022 | 3,798 | 1,291 | 433 | 0.17 | 0.76 | 1.07 | Warning -- Hessian does not appear to be positive definite |
| LL+PS(Adult) | A1-19 | 0.1 | 0.4 | 0.7 | 6,714 | 6,714 | 1,900 | <1 | 433 | 0.28 | 0.28 | 0.85 | Warning -- Hessian does not appear to be positive definite |
|  | A1-20 | 0.1 | 0.4 | 0.8 | > 10,000 | >10,000 | 8,871 | <1 | 433 | 0.26 | 0.26 | 0.92 | Warning -- Hessian does not appear to be positive definite |
|  | A1-21 | 0.1 | 0.4 | 0.9 | 9,214 | 3,837 | 2,583 | 428 | 433 | 0.28 | 0.67 | 2.04 | Warning -- Hessian does not appear to be positive definite |
|  | A1-22 | 0.1 | 0.6 | 0.7 | $>10,000$ | $>10,000$ | 5,681 | <1 | 433 | 0.36 | 0.36 | 0.30 | Warning -- Hessian does not appear to be positive definite |
|  | A1-23 | 0.1 | 0.6 | 0.8 | >10,000 | $>10,000$ | 3,378 | <1 | 433 | 0.23 | 0.23 | 0.74 | Warning -- Hessian does not appear to be positive definite |
|  | A1-24 | 0.1 | 0.6 | 0.9 | >10,000 | $>10,000$ | 7,130 | <1 | 433 | 0.20 | 0.20 | 1.13 | Warning -- Hessian does not appear to be positive definite |
|  | A1-25 | 0.1 | 0.8 | 0.7 | $>10,000$ | $>10,000$ | 3,970 | <1 | 433 | 0.29 | 0.29 | 0.45 | Warning -- Hessian does not appear to be positive definite |
|  | A1-26 | 0.1 | 0.8 | 0.8 | >10,000 | > 10,000 | 5,115 | <1 | 433 | 0.31 | 0.31 | 0.30 | Warning -- Hessian does not appear to be positive definite |
|  | A1-27 | 0.1 | 0.8 | 0.9 | $>10,000$ | 5,416 | 3,922 | 850 | 433 | 0.27 | 0.72 | 1.39 | Warning -- Hessian does not appear to be positive definite |
|  | A1-28 | 0.01 | 0.4 | 0.7 | $>10,000$ | 5,595 | 4,108 | 863 | 433 | 0.23 | 0.73 | 1.56 | Warning -- Hessian does not appear to be positive definite |
|  | A1-29 | 0.01 | 0.4 | 0.8 | $>10,000$ | >10,000 | 2,422 | <1 | 433 | 0.22 | 0.22 | 1.39 | Warning -- Hessian does not appear to be positive definite |
|  | A1-30 | 0.01 | 0.4 | 0.9 | $>10,000$ | 2,997 | 2,660 | 756 | 433 | 0.23 | 0.89 | 1.33 | Warning -- Hessian does not appear to be positive definite |
|  | A1-31 | 0.01 | 0.6 | 0.7 | >10,000 | 3,910 | 2,426 | 649 | 433 | 0.22 | 0.62 | 1.96 | Warning -- Hessian does not appear to be positive definite |
|  | A1-32 | 0.01 | 0.6 | 0.8 | 6,600 | 6,600 | 1,445 | <1 | 433 | 0.22 | 0.22 | 1.35 | Warning -- Hessian does not appear to be positive definite |
|  | A1-33 | 0.01 | 0.6 | 0.9 | $>10,000$ | $>10,000$ | 2,725 | <1 | 433 | 0.24 | 0.24 | 1.34 | Warning -- Hessian does not appear to be positive definite |
|  | A1-34 | 0.01 | 0.8 | 0.7 | >10,000 | 4,747 | 2,560 | 797 | 433 | 0.19 | 0.54 | 1.79 | Warning -- Hessian does not appear to be positive definite |
|  | A1-35 | 0.01 | 0.8 | 0.8 | 7,896 | 7,896 | 1,670 | <1 | 433 | 0.21 | 0.21 | 1.18 | Warning -- Hessian does not appear to be positive definite |
|  | A1-36 | 0.01 | 0.8 | 0.9 | 8,165 | 8,165 | 1,788 | <1 | 433 | 0.22 | 0.22 | 1.27 | Warning -- Hessian does not appear to be positive definite |
| LL+PS(Adult) <br> +PS(Juvenile) | A1-37 | 0.1 | 0.4 | 0.7 | >10,000 | 3,728 | 3,386 | 642 | 433 | 0.33 | 0.91 | 1.29 | Warning -- Hessian does not appear to be positive definite |
|  | A1-38 | 0.1 | 0.4 | 0.8 | $>10,000$ | 4,671 | 3,402 | 542 | 433 | 0.28 | 0.73 | 2.01 | Warning -- Hessian does not appear to be positive definite |
|  | A1-39 | 0.1 | 0.4 | 0.9 | $>10,000$ | $>10,000$ | 8,649 | <1 | 433 | 0.24 | 0.24 | 1.20 | Warning -- Hessian does not appear to be positive definite |
|  | A1-40 | 0.1 | 0.6 | 0.7 | >10,000 | 4,529 | 3,296 | 625 | 433 | 0.28 | 0.73 | 1.78 | Warning -- Hessian does not appear to be positive definite |
|  | A1-41 | 0.1 | 0.6 | 0.8 | $>10,000$ | 8,700 | 8,162 | 1,652 | 433 | 0.24 | 0.94 | 0.82 | Warning -- Hessian does not appear to be positive definite |
|  | A1-42 | 0.1 | 0.6 | 0.9 | $>10,000$ | >10,000 | 9,318 | <1 | 433 | 0.26 | 0.26 | 0.92 | Warning -- Hessian does not appear to be positive definite |
|  | A1-43 | 0.1 | 0.8 | 0.7 | $>10,000$ | 5,382 | 3,603 | 803 | 433 | 0.26 | 0.67 | 1.37 | Warning -- Hessian does not appear to be positive definite |
|  | A1-44 | 0.1 | 0.8 | 0.8 | $>10,000$ | 5,760 | 4,994 | 832 | 433 | 0.33 | 0.87 | 1.43 | Warning -- Hessian does not appear to be positive definite |
|  | A1-45 | 0.1 | 0.8 | 0.9 | >10,000 | 4,121 | 3,019 | 797 | 433 | 0.26 | 0.73 | 1.28 | Warning -- Hessian does not appear to be positive definite |
|  | A1-46 | 0.01 | 0.4 | 0.7 | >10,000 | 4,209 | 3,072 | 653 | 433 | 0.24 | 0.73 | 1.79 | Warning -- Hessian does not appear to be positive definite |
|  | A1-47 | 0.01 | 0.4 | 0.8 | 4,810 | 1,778 | 1,387 | 395 | 433 | 0.29 | 0.78 | 2.20 | C |
|  | A1-48 | 0.01 | 0.4 | 0.9 | 8,158 | 3,260 | 2,038 | 402 | 433 | 0.25 | 0.63 | 3.29 | Warning -- Hessian does not appear to be positive definite |
|  | A1-49 | 0.01 | 0.6 | 0.7 | >10,000 | 7,436 | 5,914 | 1,094 | 433 | 0.24 | 0.80 | 1.54 | Warning -- Hessian does not appear to be positive definite |
|  | A1-50 | 0.01 | 0.6 | 0.8 | >10,000 | 4,810 | 4,160 | 915 | 433 | 0.24 | 0.86 | 1.45 | Warning -- Hessian does not appear to be positive definite |
|  | A1-51 | 0.01 | 0.6 | 0.9 | 7,939 | 7,939 | 1,899 | <1 | 433 | 0.24 | 0.24 | 2.45 | Warning -- Hessian does not appear to be positive definite |
|  | A1-52 | 0.01 | 0.8 | 0.7 | $>10,000$ | 5,220 | 3,057 | 769 | 433 | 0.20 | 0.59 | 1.94 | Warning -- Hessian does not appear to be positive definite |
|  | A1-53 | 0.01 | 0.8 | 0.8 | $>10,000$ | 3,495 | 2,602 | 645 | 433 | 0.21 | 0.74 | 2.37 | Warning -- Hessian does not appear to be positive definite |
|  | A1-54 | 0.01 | 0.8 | 0.9 | >10,000 | 3,095 | 2,786 | 726 | 433 | 0.21 | 0.90 | 2.05 | Warning -- Hessian does not appear to be positive definite |

Table 5b Results of the four sub-areas ( 21 fleets) model
(Note 1) Yellow makers indicate convergence (C-1), while no convergences, by "Warning - "in Error Message.
(Note 2) Pink markers indicate that parameters are out of range.

| CPUE | Run no. | CAS weight | Sigma(SR) | h (steepness) | тBO | TBmsy | $\begin{gathered} \mathrm{TB} \\ \text { (current) } \end{gathered}$ | MSY | Catch (current) | Depletion | TB/TBmsy | F/Fmsy | Error Message |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  | 1,000 tons |  |  |  |  |  |  |  |  |
| LL | A4-1 | 0.1 | 0.4 | 0.7 | > 10,000 | 6,857 | 3,414 | 1,144 | 433 | 0 | 0.50 | 1.20 | Warning -- Hessian does not appear to be positive definite |
|  | A4-2 | 0.1 | 0.4 | 0.8 | > 10,000 | 5,431 | 3,001 | 900 | 433 | 0 | 0.55 | 1.49 | Warning -- Hessian does not appear to be positive definite |
|  | A4-3 | 0.1 | 0.4 | 0.9 | 7,593 | 2,783 | 1,838 | 562 | 433 | 0 | 0.66 | 2.39 | Warning -- Hessian does not appear to be positive definite |
|  | A4-4 | 0.1 | 0.6 | 0.7 | 7,854 | 2,972 | 2,176 | 597 | 433 | 0 | 0.73 | 1.57 | Warning -- Hessian does not appear to be positive definite |
|  | A4-5 | 0.1 | 0.6 | 0.8 | > 10,000 | 6,963 | 3,175 | 1,272 | 433 | 0 | 0.46 | 1.22 | Warning -- Hessian does not appear to be positive definite |
|  | A4-6 | 0.1 | 0.6 | 0.9 | 8,110 | 2,967 | 2,025 | 602 | 433 | 0 | 0.68 | 2.07 | Warning -- Hessian does not appear to be positive definite |
|  | A4-7 | 0.1 | 0.8 | 0.7 | > 10,000 | 3,867 | 2,324 | 745 | 433 | 0 | 0.60 | 1.70 | Warning -- Hessian does not appear to be positive definite |
|  | A4-8 | 0.1 | 0.8 | 0.8 | > 10,000 | 3,875 | 2,476 | 841 | 433 | 0 | 0.64 | 1.29 | Warning -- Hessian does not appear to be positive definite |
|  | A4-9 | 0.1 | 0.8 | 0.9 | 9,737 | 3,355 | 2,019 | 790 | 433 | 0 | 0.60 | 1.72 | D |
|  | A4-10 | 0.01 | 0.4 | 0.7 | 4,701 | 1,704 | 810 | 577 | 433 | 0 | 0.47 | 1.32 | Warning -- Hessian does not appear to be positive definite |
|  | A4-11 | 0.01 | 0.4 | 0.8 | 5,130 | 1,788 | 829 | 595 | 433 | 0 | 0.46 | 1.68 | Warning -- Hessian does not appear to be positive definite |
|  | A4-12 | 0.01 | 0.4 | 0.9 | >10,000 | 4,255 | 1,799 | 1,056 | 433 | 0 | 0.42 | 2.73 | Warning -- Hessian does not appear to be positive definite |
|  | A4-13 | 0.01 | 0.6 | 0.7 | 4,836 | 3,171 | 696 | 201 | 433 | 0 | 0.22 | 1.17 | Warning -- Hessian does not appear to be positive definite |
|  | A4-14 | 0.01 | 0.6 | 0.8 | 5,502 | 1,877 | 722 | 657 | 433 | 0 | 0.38 | 2.05 | Warning -- Hessian does not appear to be positive definite |
|  | A4-15 | 0.01 | 0.6 | 0.9 | 5,545 | 5,545 | 699 | <1 | 433 | 0 | 0.13 | 2.90 | Warning -- Hessian does not appear to be positive definite |
|  | A4-16 | 0.01 | 0.8 | 0.7 | 6,545 | 2,447 | 617 | 709 | 433 | 0 | 0.25 | 2.13 | Warning -- Hessian does not appear to be positive definite |
|  | A4-17 | 0.01 | 0.8 | 0.8 | 5,189 | 1,815 | 595 | 631 | 433 | 0 | 0.33 | 1.61 | Warning -- Hessian does not appear to be positive definite |
|  | A4-18 | 0.01 | 0.8 | 0.9 | 8,158 | 2,793 | 756 | 902 | 433 | 0 | 0.27 | 1.93 | E |
| LL+PS(Adult) | A4-19 | 0.1 | 0.4 | 0.7 | 6,447 | 2,555 | 1,773 | 400 | 433 | 0 | 0.69 | 3.51 | Warning -- Hessian does not appear to be positive definite |
|  | A4-20 | 0.1 | 0.4 | 0.8 | 6,691 | 2,597 | 1,778 | 441 | 433 | 0 | 0.68 | 3.14 | Warning -- Hessian does not appear to be positive definite |
|  | A4-21 | 0.1 | 0.4 | 0.9 | >10,000 | 5,203 | 3,078 | 1,162 | 433 | 0 | 0.59 | 1.09 | Warning -- Hessian does not appear to be positive definite |
|  | A4-22 | 0.1 | 0.6 | 0.7 | > 10,000 | 7,883 | 3,568 | 1,798 | 433 | 0 | 0.45 | 1.97 | Warning -- Hessian does not appear to be positive definite |
|  | A4-23 | 0.1 | 0.6 | 0.8 | $>10,000$ | 3,998 | 1,907 | 707 | 433 | 0 | 0.48 | 2.57 | Warning -- Hessian does not appear to be positive definite |
|  | A4-24 | 0.1 | 0.6 | 0.9 | >10,000 | 6,767 | 3,345 | 1,676 | 433 | 0 | 0.49 | 0.93 | Warning -- Hessian does not appear to be positive definite |
|  | A4-25 | 0.1 | 0.8 | 0.7 | >10,000 | >10,000 | >10,000 | <1 | 433 | >10 | >10 | 0.00 | Warning -- Hessian does not appear to be positive definite |
|  | A4-26 | 0.1 | 0.8 | 0.8 | 8,612 | 8,612 | 2,135 | <1 | 433 | 0 | 0.25 | 0.84 | Warning -- Hessian does not appear to be positive definite |
|  | A4-27 | 0.1 | 0.8 | 0.9 | $>10,000$ | 6,017 | 2,607 | 1,454 | 433 | 0 | 0.43 | 1.12 | Warning -- Hessian does not appear to be positive definite |
|  | A4-28 | 0.01 | 0.4 | 0.7 | >10,000 | > 10,000 | 8,158 | 5,056 | 433 | 0 | 0.46 | 2.30 | Warning -- Hessian does not appear to be positive definite |
|  | A4-29 | 0.01 | 0.4 | 0.8 | 7,328 | 4,035 | 1,956 | 999 | 433 | 0 | 0.48 | 2.21 | Warning -- Hessian does not appear to be positive definite |
|  | A4-30 | 0.01 | 0.4 | 0.9 | > 10,000 | >10,000 | 5,110 | 3,304 | 433 | 0 | 0.37 | 2.16 | Warning -- Hessian does not appear to be positive definite |
|  | A4-31 | 0.01 | 0.6 | 0.7 | 6,446 | 2,431 | 924 | 815 | 433 | 0 | 0.38 | 1.68 | Warning -- Hessian does not appear to be positive definite |
|  | A4-32 | 0.01 | 0.6 | 0.8 | > 10,000 | >10,000 | 6,586 | 4,490 | 433 | 0 | 0.40 | 2.17 | Warning -- Hessian does not appear to be positive definite |
|  | A4-33 | 0.01 | 0.6 | 0.9 | 5,570 | 3,003 | 1,499 | 722 | 433 | 0 | 0.50 | 1.45 | Warning -- Hessian does not appear to be positive definite |
|  | A4-34 | 0.01 | 0.8 | 0.7 | 4,017 | 1,438 | 622 | 527 | 433 | 0 | 0.43 | 2.26 | Warning -- Hessian does not appear to be positive definite |
|  | A4-35 | 0.01 | 0.8 | 0.8 | 8,792 | 3,319 | 998 | 966 | 433 | 0 | 0.30 | 3.54 | Warning -- Hessian does not appear to be positive definite |
|  | A4-36 | 0.01 | 0.8 | 0.9 | > 10,000 | 8,686 | 2,652 | 1,853 | 433 | 0 | 0.31 | 2.45 | Warning -- Hessian does not appear to be positive definite |
| LL+PS(Adult) <br> +PS(Juvenile) | A4-37 | 0.1 | 0.4 | 0.7 | 7,671 | 3,137 | 1,979 | 414 | 433 | 0 | 0.63 | 3.03 | Warning -- Hessian does not appear to be positive definite |
|  | A4-38 | 0.1 | 0.4 | 0.8 | 5,800 | 2,189 | 1,637 | 436 | 433 | 0 | 0.75 | 2.52 | Warning -- Hessian does not appear to be positive definite |
|  | A4-39 | 0.1 | 0.4 | 0.9 | 5,592 | 2,107 | 1,600 | 391 | 433 | 0 | 0.76 | 3.31 | F |
|  | A4-40 | 0.1 | 0.6 | 0.7 | 7,102 | 2,820 | 2,168 | 459 | 433 | 0 | 0.77 | 2.20 | G |
|  | A4-41 | 0.1 | 0.6 | 0.8 | 9,481 | 3,409 | 2,013 | 639 | 433 | 0 | 0.59 | 2.24 | Warning -- Hessian does not appear to be positive definite |
|  | A4-42 | 0.1 | 0.6 | 0.9 | 5,627 | 2,070 | 1,557 | 472 | 433 | 0 | 0.75 | 1.91 | Warning -- Hessian does not appear to be positive definite |
|  | A4-43 | 0.1 | 0.8 | 0.7 | > 10,000 | 7,283 | 2,676 | 1,167 | 433 | 0 | 0.37 | 1.61 | Warning -- Hessian does not appear to be positive definite |
|  | A4-44 | 0.1 | 0.8 | 0.8 | 6,841 | 2,487 | 1,655 | 632 | 433 | 0 | 0.67 | 1.30 | Warning -- Hessian does not appear to be positive definite |
|  | A4-45 | 0.1 | 0.8 | 0.9 | 7,607 | 2,659 | 1,886 | 701 | 433 | 0 | 0.71 | 1.27 | H |
|  | A4-46 | 0.01 | 0.4 | 0.7 | > 10,000 | 7,025 | 4,014 | 1,622 | 433 | 0 | 0.57 | 2.22 | Warning -- Hessian does not appear to be positive definite |
|  | A4-47 | 0.01 | 0.4 | 0.8 | 5,402 | 2,782 | 1,459 | 728 | 433 | 0 | 0.52 | 1.58 | Warning -- Hessian does not appear to be positive definite |
|  | A4-48 | 0.01 | 0.4 | 0.9 | 7,242 | 4,041 | 2,439 | 1,046 | 433 | 0 | 0.60 | 1.45 | 1 |
|  | A4-49 | 0.01 | 0.6 | 0.7 | >10,000 | >10,000 | 5,801 | 2,486 | 433 | 0 | 0.49 | 2.03 | Warning -- Hessian does not appear to be positive definite |
|  | A4-50 | 0.01 | 0.6 | 0.8 | 5,635 | 2,126 | 1,383 | 863 | 433 | 0 | 0.65 | 1.51 | J |
|  | A4-51 | 0.01 | 0.6 | 0.9 | 7,803 | 3,202 | 2,127 | 1,245 | 433 | 0 | 0.66 | 1.57 | Warning -- Hessian does not appear to be positive definite |
|  | A4-52 | 0.01 | 0.8 | 0.7 | 8,292 | 8,292 | 1,619 | <1 | 433 | 0 | 0.20 | 2.30 | Warning -- Hessian does not appear to be positive definite |
|  | A4-53 | 0.01 | 0.8 | 0.8 | $>10,000$ | 5,899 | 2,567 | 1,809 | 433 | 0 | 0.44 | 2.14 | Warning -- Hessian does not appear to be positive definite |
|  | A4-54 | 0.01 | 0.8 | 0.9 | >10,000 | > 10,000 | 8,328 | 4,491 | 433 | 0 | 0.51 | 1.95 | Warning -- Hessian does not appear to be positive definite |



Fig. 6 YFT stock status (Kobe plot) (2020) showing 9 converged grids(runs) and the median point by the yellow dot.
(Note) Area model A1: One area (9 fleets) model and A4: 4 sub-areas (21 fleets) model.


Fig. 7 YFT Stock status trajectories (Kobe plot) of the median among the 9 converged runs (grids)

## 4. Discussion

The aim of our stock assessment is to provide plausible stock status as reference for SS3. Thus we tries to use the same data as in SS3 and mainly explored the stock status (point estimate) using large grids (108) by combining 5 factors (area, CPUE, $\sigma$, steepness and weighting for CAS). However, only 9 grids produced convergences and we define the median point as the representative stock status in 2020, i.e., $F_{2020} / F m s y=1.84$ with TB2020/TBmsy=0.74 (situation of overfished and overfishing).

We consider that $\mathrm{F}_{2020} / \mathrm{Fmsy}=1.84$ is implausible under the current situation. We consider that there are likely four potential causes on "less numbers of convergences" and "high $F_{2020} /$ Fmsy", i.e., (a) usages of one set of initial population seeding values, (b) underestimated MSY (see the $2^{\text {nd }}$ graph, page 15), (c) fitness problems of size frequency data on three fleets (f5_Gillnet, f6_PSFS and f7_handline, see page 21) and/or (d) other unforeseen reasons. (b) and (c) may be caused by (a). Thus, usages of different seeding values may solve these problems. Therefore, the SCAS results for this time need be looked at a caution.

## AcKNOWLEDGEMENTS

We sincerely thank to the IOTC Secretariat to provide the data used in the SCAS. We also appreciate Dan Fu (Secretariat) to assist relevant input information in SS3.

## References

Fu et al (2018) preliminary Indian Ocean yellowfin tuna stock assessment 1950-2020 (stock synthesis) (IOTC-2018-WPTT23-33).

Fu et al (2021) preliminary Indian Ocean yellowfin tuna stock assessment 1950-2020 (stock synthesis) (IOTC-2021-WPTT23-12).

Guéry et al (2021) Standardized purse seine CPUE of Yellowfin tuna in the Indian Ocean for the European fleet (IOTC-2021-WPTT23-10).

IOTC (2021) Report of the 23rd Session of the IOTC Working Party on Tropical Tunas, Data Preparatory Meeting (IOTC-2021-WPTT23(DP)-R[E]).

Kitakado et al (2021) Updated report of trilateral collaborative study among Japan, Korea and Taiwan for producing joint abundance indices for the yellowfin tunas in the Indian Ocean using longline fisheries data up to 2020 (IOTC-2021- WPM12-18 \& WPTT23(AS)-11).

Nishida, T., Rademeyer, R., Ijima, H., Sato, K., Matsumoto, T., Kitakado, T. and Fonteneau, A. (2012) Stock and risk assessments on yellowfin tuna (Thunnus albacares) in the Indian Ocean based on ADMB implemented ASPM and Kobe I + II software (IOTC-2012-WPTT14-40 Rev_2).

Nishida et al (2018) Preliminary stock assessment of Indian Ocean yellowfin tuna using SCAA (Statistical-Catch-At-Age) (IOTC-2018-WPTT20-41_Rev1).

Nishida et al (2021) Development of Statistical-Catch-At-Size (SCAS) software (IOTC-2021-WPTT23-INFO3_REV1).

Appendix A. Results of the SCAS stock assessment (Median of 9 converged grids) (refer to Figs. 5 and 6)

Catch (tons)



F vs. Fmsy

_F Fmsy




Selectivity



CPUE


Fitness of size frequency distribution

(3_LS) \% Size freq distribution (observed vs. predicted)

(4_OT) \% Size freq distribution (observed vs. predicted)

(5_GL) \% Size freq distribution (observed vs. predicted)

(6_FS) \% Size freq distribution (observed vs. predicted)

(7_HD) \% Size freq distribution (observed vs. predicted)

(8_LF) \% Size freq distribution (observed vs. predicted)




[^0]:    1 Submitted to the IOTC WPTT23 (AS) (October 25-30, 2021) (online)

