

**STANDARDIZED CPUE FOR YELLOWFIN TUNA (*THUNNUS ALBACARES*)  
OF THE JAPANESE LONGLINE FISHERY IN THE INDIAN OCEAN  
BY GENERALIZED LINEAR MODELS (GLM) (1960-2000)**

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**ABSTRACT**

*We performed the CPUE standardization for yellowfin tuna in the Indian Ocean from 1960 to 2000 using the updated Japanese longline catch and effort data which were aggregated by month, 5x5 degree square and the number of hooks between floats (NHF) by the typical generalized linear models (GLM) called CPUE model with log-normal error. The main purpose of this analysis is to make the CPUE index as an input for age specific production models (ASPM). We incorporated the six explanatory variables, YEAR, MONTH, AREA, NHF, SST and SOI, as the main effect and/or two-way interactions into the GLM analyses. We computed the standardized yellowfin CPUE and abundance-index (i.e. area-weighted CPUE) using the statistical F-test based on the value of deviance. These two indices selected show very similar trends, decrease drastically in 1960s and 1970s, and after that seem to be rather stable.*

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**INTRODUCTION**

There are several studies regarding CPUE standardization of tropical tuna such as bigeye and yellowfin in the Indian Ocean using generalized linear models (GLM) (Nishida, 2000; Okamoto *et al.*, 2001). However, full-scaled stock assessment about yellowfin tuna has not been done since 1995 because of the lack of the size data. Therefore, we carried out the CPUE standardization of yellowfin tuna in the Indian Ocean using updated Japanese longline data by the GLM and estimated CPUE index (i.e. year trend of abundance) as an input for an age-specific production model (ASPM) (Nishida and Shono, 2002).

**MATERIALS AND METHODS**

**Data**

The Japanese longline catch and effort statistics from 1975 to 2000, which were aggregated by month, 5x5 square area and the number of hooks between floats (NHF), were used for the analysis. Similar data from 1952 to 1974 were used, although

it did not include the information on NHF. Then, we assume that the NHF is 6.

**Model configuration**

In order to standardize CPUE of yellowfin, we used the generalized linear models in this analysis. We used the CPUE with log-normal error and the calculation was performed through GLM procedure of SAS/STAT package (Version 8.2.). At first, the following form was assumed as a full model.

$$\log(\text{CPUE} + \text{constant}) = \text{INTERCEPT} + \text{YEAR} + \text{MONTH} + \text{AREA} + \text{GEAR} + \text{SST} + \text{SOI} + \text{INTERACTION} + \text{ERROR}, \text{ERROR} \sim N(0, \sigma^2) \quad (1)$$

where

log: natural logarithm,

CPUE: nominal CPUE (number of yellowfin catch per 1000 hooks),

INTERCEPT: intercept,

YEAR: effect of year,

MONTH: effect of month,

AREA: effect of area,

GEAR: effect of NHF,

SST: effect of sea surface temperature,

SOI: effect of southern oscillation index,

INTERACTIONS: two-way interactions.

Precisely, formula (1) is written in formula (2). In order to overcome the problem of zero catch, 0.1 was uniformly added to each value of nominal CPUE as the constant term. The small constant value was selected to decrease the bias in such calculation. The following two-way interactions were used as a full model. Other interactions could not be included into this full model because of missing data.

- full model -

$$\log(CPUE_{ijkl} + 0.1) = INTERCEPT + YEAR_i + MONTH_j + AREA_k + GEAR_l + SST + SOI + (YEAR * AREA)_{ik} + (MONTH * AREA)_{jk} + (MONTH * GEAR)_{jl} + (AREA * GEAR)_{kl} + (AREA * SST)_k + (AREA * SOI)_k + ERROR_{ijkl}$$

(2)

where

i (YEAR): 1960-2000,

j (MONTH): 1-12,

k (AREA): 1-6,

l (GEAR): 1-4 (class 1: 5-6, class 2: 7-10, class 3: 11-14, class 4: 15-24).

Remark) SST and SOI were incorporated as a continuous variable.

YEAR, MONTH, AREA, GEAR, SST and SOI were incorporated as the main effect. We used the data from 1960 to 2000. The area stratification is shown in Figure 1. Considering the distributions of effort (the number of hooks per 1000) and CPUE of yellowfin tuna in the Indian Ocean (shown in Figure 2 and 3), main fishing ground was divided into six areas for the analysis. The number of branch lines between floats (NHF) was divided into 4 classes, though the NHF was fixed to 6 before 1974 because of no information about NHF, and incorporated into the model as an effect of gear.

We also added the effect of SST and SOI to the model as environmental factors that may have affected the yellowfin stock status and recruitment. Although the index of Indian oscillation index (IOI) is available from 1972 to 2000, SOI index was used instead of IOI in this analysis because of the problem about missing data and/or the possible autocorrelation problem between SOI and IOI.

### Model selection

We performed the model selection using the stepwise F-test based on the value of deviance (Dobson, 1990). As a result of the test all about the path that can be considered, the following model with many explanatory variables was finally selected. (i.e. Only the main effect of SOI was deleted from the full model.) Significant level was assumed to be one percentage. The results of ANOVA are shown in Table 1.

- final model -

$$E[\log(CPUE+0.1)] = INTERCEPT + YEAR + MONTH + AREA + GEAR + SST + (YEAR*AREA) + (MONTH*AREA) + (MONTH*GEAR) + (AREA*GEAR) + (AREA*SST) + (AREA*SOI) \quad (3)$$

### CPUE and Abundance Index

CPUE index in year i and in a whole area is estimated by the following equation.

$$CPUE_i = \exp\{INTERCEPT + YEAR_i + \overline{(YEAR * AREA)}_i\} - 0.1, (i = 1960, \dots, 2000) \quad (4)$$

where

$$\overline{(YEAR * AREA)}_i = \frac{1}{N_k} \sum_{k=1}^{N_k} (YEAR * AREA)_{ik}$$

The terms of  $CPUE_i + \text{constant}$  (i.e. 0.1) means the Least Squared Means (LSMEANS) of YEAR effect in GLM procedure of SAS package.

The CPUE index in year i and area k is obtained from the following formula.

$$\begin{aligned}
CPUE_{ik} = \exp\{INTERCEPT + YEAR_i + AREA_k + (YEAR * AREA)_{ik} \\
+ (\overline{MONTH * AREA})_k + (\overline{AREA * GEAR})_k + (\overline{AREA * SST})_k \\
+ (\overline{AREA * SOI})_k\} - 0.1, \quad (i = 1960, \dots, 2000; k = 1, \dots, 6)
\end{aligned}
\tag{5}$$

where

$$\begin{aligned}
\overline{(MONTH * AREA)}_k &= \frac{1}{N_j} \sum_{j=1}^{N_j} (MONTH * AREA)_{jk}, \\
\overline{(AREA * GEAR)}_k &= \frac{1}{N_l} \sum_{l=1}^{N_l} (AREA * GEAR)_{lk} \quad \text{etc.}
\end{aligned}$$

The terms of  $CPUE_{ik} + \text{constant}$  (i.e. 0.1) means the Least Squared Means (LSMEANS) of (YEAR\*AREA) effect in GLM procedure of SAS package.

Abundance index in  $i$  year and in a whole area is estimated by the following equation.

$$AbundanceIndex_i = \sum_{k=1}^{N_k} w_k \cdot CPUE_{ik}, \quad (i = 1960, \dots, 2000) \tag{6}$$

where

$$w_k = (\text{Size of area } k) / (\text{Size of total area}), \quad \sum_{k=1}^{N_k} w_k = 1$$

The relative area size is shown in Table 2.

## RESULTS AND DISCUSSIONS

Figure 4 shows the comparison of the trends between standardized and nominal CPUE. Those two trends are considerable similar until 1970s. The trend of standardized CPUE is smoother than that of nominal one since 1980. It is seemed to be natural because CPUE standardization probably corrects the various effects in this analysis. Figure 5 shows the standardized CPUE trend and its ninety-five percent confidence intervals. Its confidence intervals are rather narrow, especially after the period of 1980s.

Figure 6 shows the trends of standardized CPUE (that is not weighted by area size) and abundance index (that is weighted by area size). These two trends are almost same except the period of 1960s. However, in order to estimate the present/future stock status more precisely, we decided to utilize this standardized abundance index as an input for an age-specific production model (ASPM) (Nishida and Shono, 2002). The distribution of overall residual in the final model is shown in Figure 7. Judging from the distributed pattern, the log-normal model we used this time seems to be appropriate.

The year trends of standardized CPUE/abundance-index seem to be rather stable in the 1980s and 1990s, although small yellowfin catch by purse fishery has been increased rapidly after the middle of 1980s. This implies that standardized CPUE by GLM may not reflect the real stock status for yellowfin tuna in the Indian Ocean, especially after in the middle of 1980s. Therefore, it seems to be needed to consider the alternative statistical methods such as tree regression models (we are now trying to calculate by the tree model.) and discuss those CPUE trends from the biological point of view.

## ACKNOWLEDGEMENT

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Table 1. Results of ANOVA for the final selected model in the GLM analysis.

Source	DF	Sum of Squares	Mean Square	F value	Pr > F
Model	374	52639.8452	140.7482	96.66	<.0001
Error	41129	59888.9991	1.4561		
Corrected Total	41503	112528.8443			
R-Square	0.46779	CoeffVar	Root MSE	logC PUE Mean	
		113.6589	1.2067	1.061686	
Source	DF	Type II SS	Mean Square	F value	Pr > F
year	40	5921.477046	148.036926	101.66	<.0001
month	11	699.874007	63.62491	43.69	<.0001
area	5	1780.47347	356.094694	244.55	<.0001
gear	3	286.062939	95.354313	65.48	<.0001
sst	1	5573.618928	5573.618928	3827.7	<.0001
year*area	200	2878.887656	14.394438	9.89	<.0001
month*area	55	2837.212016	51.585673	35.43	<.0001
month*gear	33	311.779955	9.447877	6.49	<.0001
area*gear	15	1058.99164	70.599443	48.48	<.0001
sst*area	5	1639.9895	327.9979	225.25	<.0001
soi*area	6	38.171414	6.361902	4.37	0.0002
Source	DF	Type III SS	Mean Square	F value	Pr > F
year	40	3711.794817	92.79487	63.73	<.0001
month	11	577.668603	52.515328	36.07	<.0001
area	5	2731.943081	546.388616	375.23	<.0001
gear	3	106.305055	35.435018	24.34	<.0001
sst	1	675.654006	675.654006	464.01	<.0001
year*area	200	2878.887656	14.394438	9.89	<.0001
month*area	55	2837.212016	51.585673	35.43	<.0001
month*gear	33	311.779955	9.447877	6.49	<.0001
area*gear	15	1058.99164	70.599443	48.48	<.0001
sst*area	5	1639.9895	327.9979	225.25	<.0001
soi*area	6	38.171414	6.361902	4.37	0.0002

Table 2. Area Index for weighting.

Area	Scaled size of each area	Area index for weighting
1	1031	0.074737224
2	2719	0.197100399
3	3206	0.232403045
4	3260	0.236317506
5	2463	0.17854295
6	1116	0.080898876
<b>Total</b>	<b>13795</b>	<b>1</b>

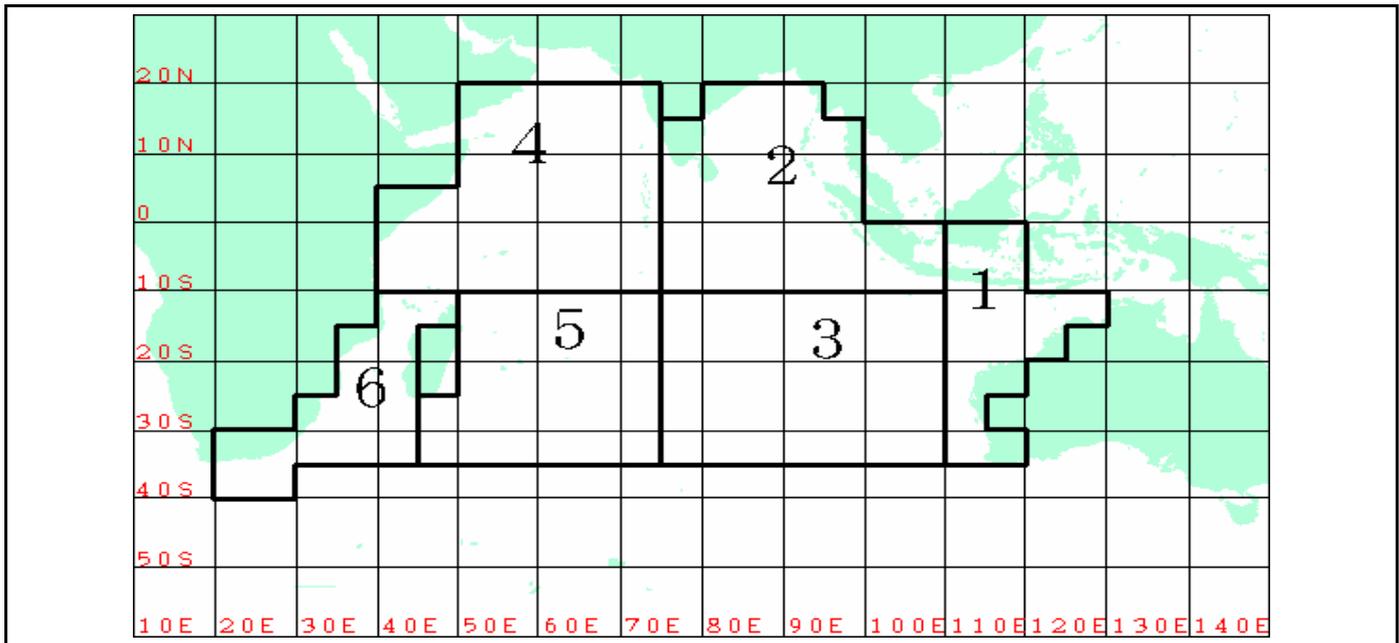


Figure 1. Area stratification used for the standardization of yellowfin CPUE.

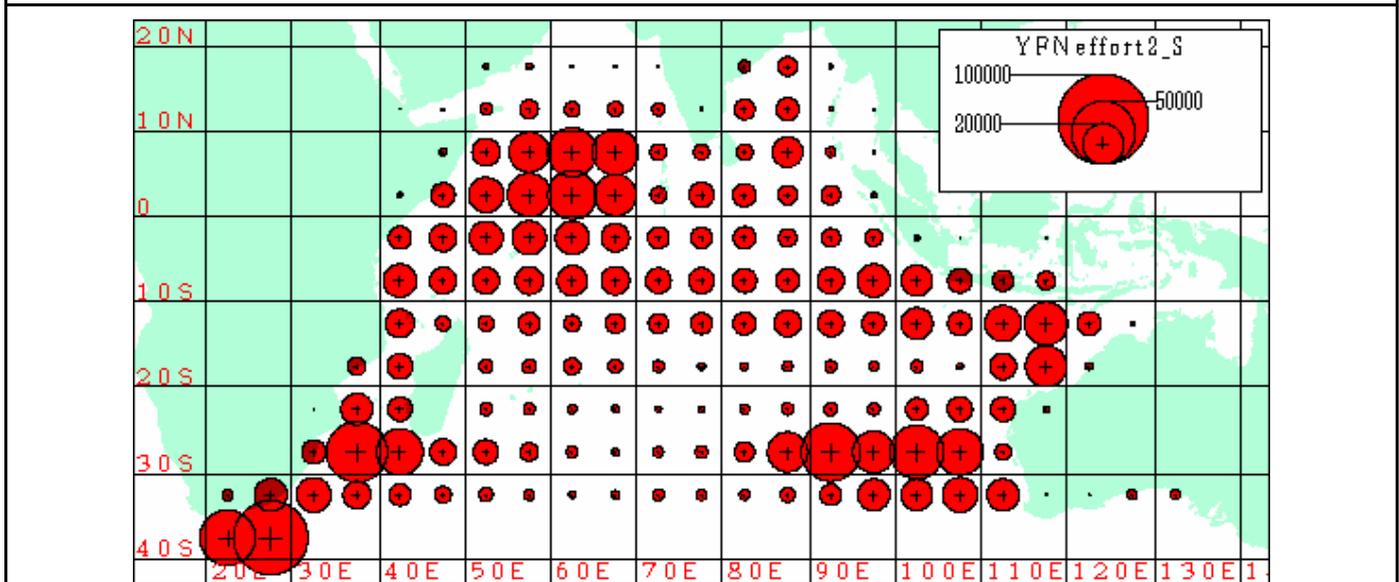


Figure 2. Geographical distribution of Japanese longline effort (in 1000 hooks) in the Indian Ocean, 1960-2000.

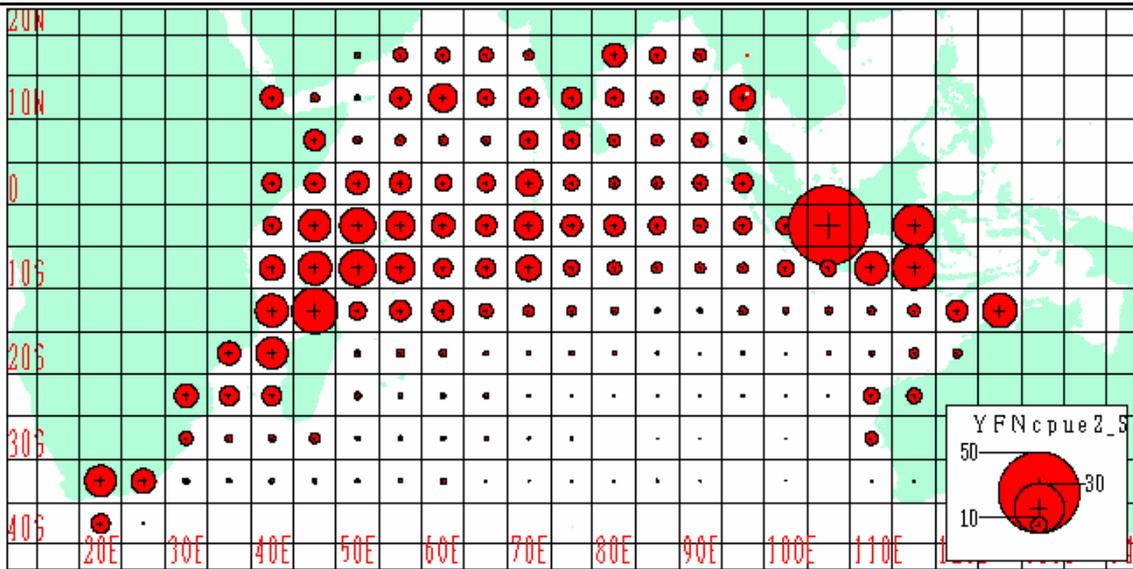


Figure 3. Nominal CPUE (catch number per 1000 hooks) for yellowfin tuna in the Indian Ocean, 1960-2000.

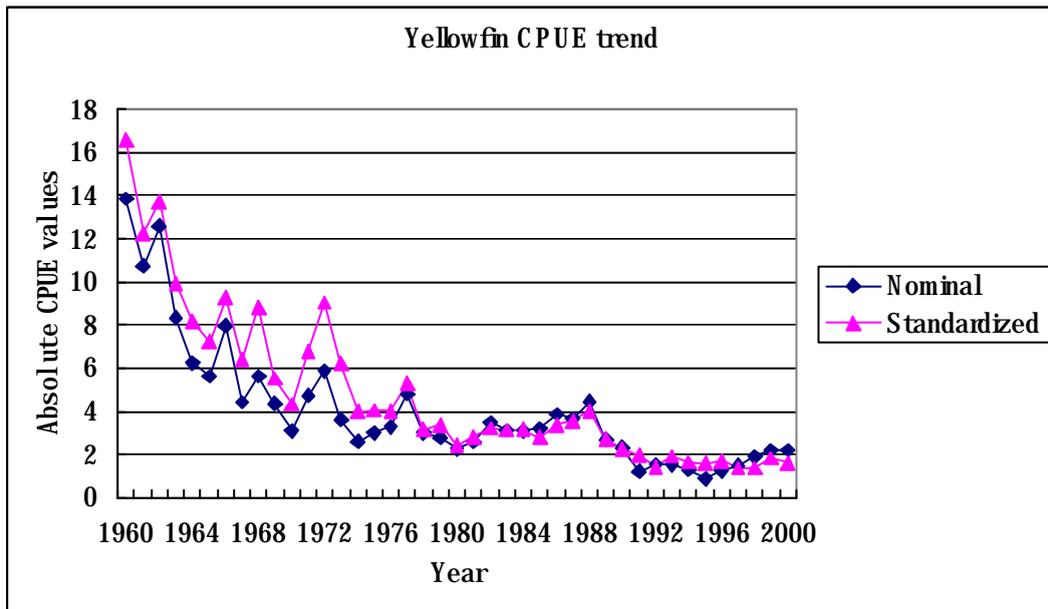


Figure 4. Trends of standardized CPUE and nominal one those are not weighted by area size.

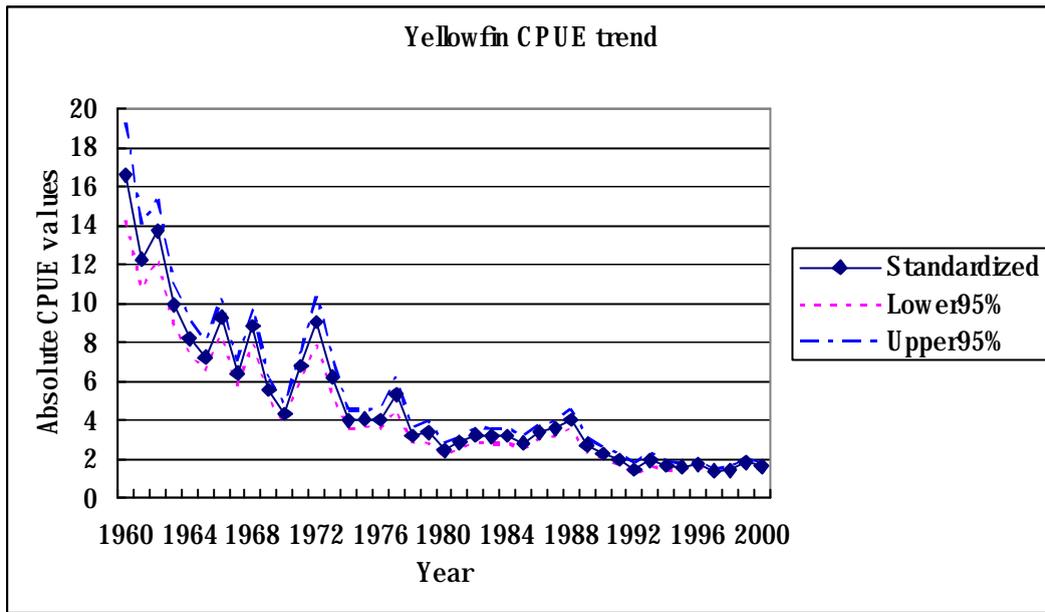


Figure 5. Trends of standardized CPUE and its 95% confidence intervals that those are not weighted by area size.

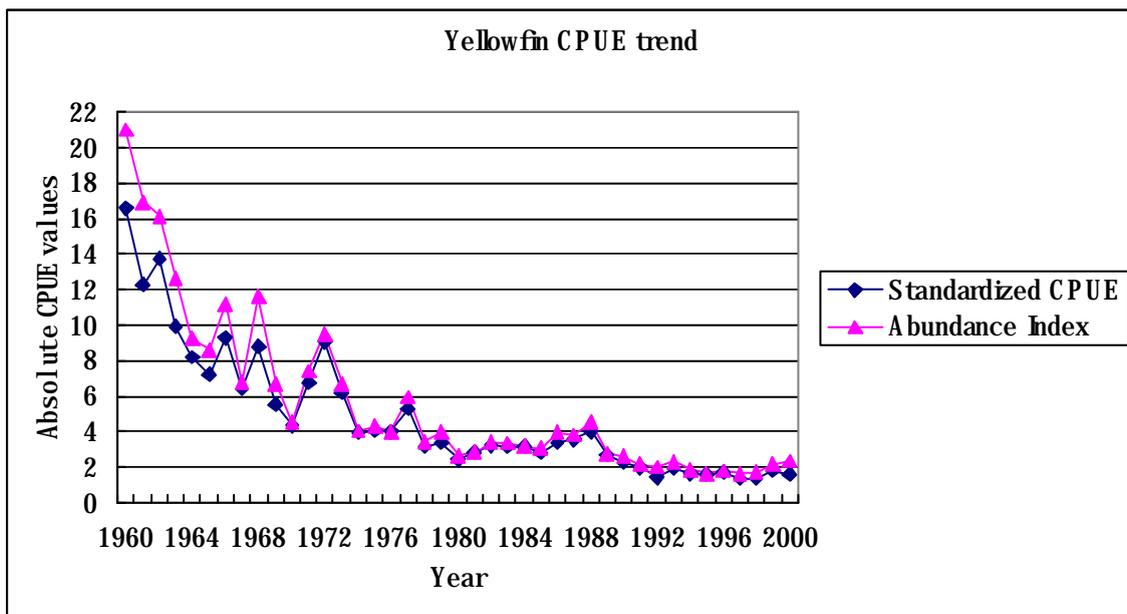
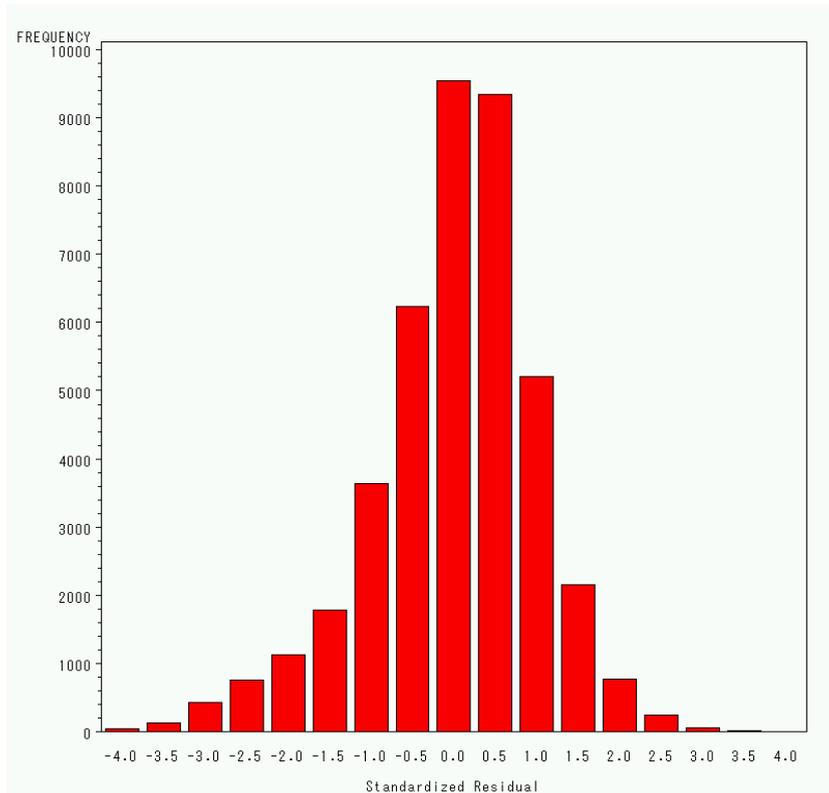


Figure 6. Trends of standardized CPUE (that is not weighted by area size) and standardized abundance index (that is weighted by area size).



*Figure 7. Histogram to standardized residuals in this analysis, 1960-2000*