Procedures for Bycatch Estimation of Prohibited<br>Species in the 1989 Bering Sea Domestic<br>Trawl Fisheries

by<br>Jerald D. Berger, Russell F. Kappenman,<br>Loh-Lee Low, and Richard J. Marasco

Alaska Fisheries Science Center National Marine Fisheries Service National Oceanic and Atmospheric Administration Building 4, BIN Cl5700 7600 Sand Point Way N.E. Seattle, Washington 98115

## ABSTRACT

'"In August 1989, the Bering Sea-Aleutian Island Groundfish Fishery Management Plan was amended in order to control the bycatch of prohibited species in the domestic groundfish fisheries. This paper: 1) describes the procedures used by the National Marine Fisheries Service to estimate the prohibited species bycatch, 2) summarizes how these procedures were developed, 3) presents prohibited species catch estimates through 5 August 1989 .
Page
INTRODUCTION ..... 1
METHODS AND DATA ..... 2
Data Base ..... 2
Estimation Procedure ..... 2
Robust Linear Regression Estimator ..... 2
Best Blend Estimator ..... 9
Groundfish Target Categories ..... 11
RESULTS ..... 12
REFERENCES ..... 16

Amendment 12A, an amendment to the Bering Sea-Aleutian Island Groundfish Fishery Management Plan for controlling bycatch of prohibited species in the domestic groundfish fisheries, was approved in late August 1989. The National Marine Fisheries Service (NMFS) is charged with its implementation. One of the requirements of the amendment is the estimation of the amount of prohibited species--Pacific halibut (Hippoglossus stenolepis), snow (Tanner) crabs (Chionoecetes spp.), and king crabs (Paralithodes and Lithodes spp.) --taken as bycatch in both joint venture and domestic fisheries.

Observers have been required on board all foreign processor vessels to sample the catch delivered by U.S. catcher vessels. Bycatch of prohibited species can be estimated for joint venture processing (JVP) from these samples.

The estimation of bycatch in the domestic annual processing (DAP) fisheries, on the other hand, is considerably more difficult. The level of observer coverage in DAP fisheries to date is insufficient for estimation of bycatch. Therefore, other procedures had to be found. This report explains two methods developed to estimate DAP bycatch.

## METHODS AND DATA

Data Base
Information collected from joint venture fisheries make up the largest data set for investigating bycatch in the eastern Bering Sea. The data are aggregated into cells defined by week, area, and fishery type.. The areal divisions are fisheries management areas established by the North Pacific Fishery Management Council (Fig. 1). The fishery types are defined by gear and target species, namely Atka mackerel (Pleurogrammus mononteryaius), walleye pollock (Theragra chalcosramma) bottom trawl, other groundfish bottom trawl, walleye pollock midwater trawl, and flatfish bottom trawl. For each cell, the data file includes the catch of various groundfish species as well as bycatches of the prohibited species (halibut and crabs).

Bycatch rates for crabs and halibut are provided by the NMFS observer program and are expressed in terms of numbers of animals per metric ton of groundfish. Halibut bycatch rates are also expressed in terms of kilograms per metric ton of groundfish.

## Estimation Procedures

## Robust Linear Regression Estimator

A robust linear regression estimator for estimating bycatch for halibut and C. bairdi crab is proposed for DAP fisheries in the eastern Bering Sea. The linear estimator is of the form:

$$
\begin{equation*}
y=b_{1} x_{1}+b_{2} x_{2}+b_{3} x_{3}+b_{4} x_{4}, \tag{1}
\end{equation*}
$$



Figure 1. --Bering Sea by catch management, Zone 1.
where $y$ represents total bycatch of a given prohibited species and $x_{1}, x_{2}, x_{3}$ and $x_{4}$ represent, respectively, the total pollock, Pacific cod (Gadus macrocephalus), yellowfin sole (Limanda aspera)., and other flatfish catches, for a given week by a group of boats fishing in the same subarea for the same target species. The values of the coefficients, $b, b_{2}, b$, and $b$, depend $u p o n$ which prohibited species bycatch is being estimated and, possibly, on the time and location of the fishery (i.e., year, quarter and subarea).

Data obtained from the monitoring of 1986-88 JVP operations by observers were used to estimate values for the coefficients in Equation (1). These data were in the form ( $\mathrm{y}_{1}, \mathrm{x}_{11}, \mathrm{x}_{21}, \mathrm{x}_{31}$, $\left.x_{41}\right), \ldots,\left(y_{n}, x_{1 n}, x_{2 n}, x_{3 n}, x_{4 n}\right)$, where $\left(y_{1}, x_{11}, x_{21}, x_{31}, x_{41}\right)$ represents the i-th observation.

A robust linear regression analysis procedure developed by Kappenman (1988) was used for determining the bj's in Equation (1). Since interest is in estimating total prohibited species bycatch, the following constraint was imposed:
$\Sigma y_{1}=\Sigma\left(b_{1} x_{11}+b_{2} x_{21}+b_{3} x_{31}+b_{4} x_{41}\right)$.
The Kappenman regression procedure leads to the following procedure for determining the $\mathrm{b}_{\mathrm{j}}$ 's in Equation (1). Set

$$
\begin{array}{ll}
z_{1}=y_{1}-\left(\Sigma y_{l} / \Sigma x_{11}\right) x_{11}, & w_{11}=x_{21}-\left(\Sigma x_{21} / \Sigma x_{11}\right) x_{11} \\
w_{21}=x_{31}-\left(\Sigma x_{31} / \Sigma x_{11}\right) x_{11}, & w_{31}=x_{41}-\left(\Sigma x_{41} / \Sigma x_{11}\right) x_{11}, \\
v_{1}=\left(1 /\left(1+\left(z_{1}-b_{20} w_{11}-b_{30} w_{21}-b_{40} w_{31} / d\right)^{2}\right)\right),
\end{array}
$$

and $d=$ median $\left\{\left|z_{1}-b_{20} w_{11}-b_{30} w_{21}-b_{40} w_{31}\right|\right\}$. Here $b_{20}, b_{30}$, and $b_{40}$ are the least absolute value estimates of $b_{2}, b_{3}$, and $b$, , that is, the values of $b_{2}, b_{3}$, and $b_{4}$ which minimize

$$
\Sigma\left|y_{1}-b_{2} w_{11}-b_{3} w_{21}-b_{4} w_{41}\right|
$$

Then appropriate values for $b_{2}, b_{3}$, and $b_{4}$ are the values of these coefficients which minimize

$$
\begin{equation*}
\Sigma v_{1}\left(z_{1}-b_{2} w_{11}-b_{3} w_{21}-b_{4} w_{31}\right)^{2} \tag{3}
\end{equation*}
$$

Once these values are found, an appropriate value for $b$, is
$b_{1}=\left(\Sigma y_{1}-b_{2} \Sigma \mathrm{x}_{21}-b_{3} \Sigma \mathrm{x}_{31}-\mathrm{b}_{4} \Sigma \mathrm{x}_{41}\right) / \Sigma \mathrm{x}_{11}$.
The analysis of the 1986-88 JVP observer data indicated that the linear regression error distributions are reasonably symmetric and have tails which are much heavier than those of the normal distribution. This suggests that least squares regression analysis is not appropriate for use in estimating the coefficients, and a linear regression analysis, which works well when the error distribution is heavy tailed and symmetric, should be used.

The values of $b_{2}, b_{3}$, and $b_{4}$ which minimize Equation (3) are approximations for maximum likelihood estimates of these coefficients, if the error distribution belongs to the Student "t" family of distributions with heavier than normal tails.

In order to determine whether or not appropriate values for the $\mathrm{b}_{\mathrm{j}}$ 's in Equation (1) depend upon year, quarter, or subarea, the following eight models were examined:
$M_{1}$ : the values of the $b$, 's depend upon the year, the subarea, and the quarter in which the $\mathrm{x}_{1}$ 's are observed.
$M_{2}$ : the values of the $b_{j}$ 's depend upon the year and the quarter in which $\mathrm{x}_{1}$ 's are observed, but not on the subarea.
$M_{3}$ : the values of the $b_{j}$ 's depend upon the year and the subarea in which the $x_{1}$ 's are observed, but not on the quarter.
$M_{4}$ : the values of the $b_{1}$ 's depend upon the year in which the $x_{j}{ }^{\prime}$ s are observed, but not the quarter and subarea.
$M_{\text {, }}$ : the values of the $b_{1}$ 's depend upon the subarea and the quarter in which the $x_{1}$ 's are observed, but not the year.
$M_{6}$ : the values of the $b_{j}$ 's depend upon the quarter in which the $x_{i}$ 's are observed, but not the year and subarea.
$M_{1}$ : the values of the $b_{j}$ 's depend upon the subarea in which the $x_{1}$ 's are observed but not the year and the quarter.
$M_{1}:$ the values of the $b_{j}$ 's depend upon neither the year nor the quarter nor the subarea in which the $\mathrm{x}_{1}$ 's are observed.

The $n$ vectorial observations $\left(y_{1}, x_{11}, x_{21}, x_{31}, x_{41}\right), \ldots$,
$\left(Y_{n}, X_{1 n}, X_{\mathbf{2 n}}, \mathbf{x}_{\mathbf{3 n}}, \mathbf{x}_{\mathbf{4} \boldsymbol{n}}\right)$ may be used to select an appropriate model from among those just listed.

For a given model and a given observed prohibited species catch, $y_{j}^{\prime \prime}$ we can calculate a predicted value for $y_{i}$ as follows:
a. delete the vectorial observation ( $Y_{1}, x_{1]}, x_{21}, x_{3 \mid}, x_{4 \mid}$ ) from the data;
b. use the remaining $n-1$ vectorial observations to estimate values for the parameters in the model;
c. apply the model, with parameters replaced by their estimates, to $\left(x_{1 j}, x_{2 j} x_{3 j}, x_{4 j}\right.$, to get a predicted value for $y_{j}$.

A predicted value for each of $y_{1}, Y_{2}, \ldots, Y_{n}$ is obtained in this manner for each model being considered. Let

$$
Y_{1 M_{n}}, \cdots, Y_{n M_{n}}
$$

represent the predicted values of $y, \ldots . ., y_{n}$ for model $M_{h}$, $h=1, \ldots, 8$. Set

$$
\operatorname{PrESAV}\left(M_{h}\right)=\sum_{i=1}^{n}\left|y_{i}-y_{i M_{h}}\right|
$$

for $h=1, \ldots, 8$. To select an appropriate model, we examine the prediction sum of absolute values (PRESAV) for the various models and look for those models which produce small PRESAV's.

The following values for prediction sum of absolute values were found when 19-87-88 JVP observer-obtained weekly summary data were used:

## Prohibited Species

| Model | Halibut | C. bairdi | Red king crab |
| :--- | :---: | :---: | :---: |
| $M_{1}$ | 2785873 |  | 883891 |

These results indicate that reasonable models appear to be $M_{6}$ for halibut and $M_{5}$ for $C$. bairdi and red king crab
(Paralithodes camtschatica). If subarea is unknown, as is frequently the case with DAP trawl catch, $M_{6}$ might also be used as a model for C. bairdi and red king crab bycatch estimation.

The 1986-88 JVP observer data were used to get appropriate values for the $\mathrm{b}_{j}$ 's in Equation (1). When the bycatch of Pacific halibut is to be estimated, the $\mathrm{b}_{j}$ coefficients are

| Quarter | $\underline{b}_{\mathbf{1}}$ | $\underline{b}_{\mathbf{2}}$ | $\underline{b}_{\mathbf{3}}$ | $\underline{b}_{4}$ |
| :--- | :---: | :---: | :---: | :---: |
|  |  | 1.1007 | 11.2288 | 0.9586 |
|  | 2.3226 | 19.3926 | 0.4108 | 0.6760 |
| 2 | 3.1192 | 8.1258 | 4.6134 | 6.3910 |
| 3 | 2.2913 | 24.4234 | 7.2488 | 0 |

When the bycatch of $C$. bairdi is to be estimated, the $b_{j}$ coefficients are

| Quarter | $\underline{b}_{\mathbf{1}}$ | $\underline{b}_{\mathbf{2}}$ | $\underline{b}_{3}$ | $\underline{b}_{4}$ |
| :--- | :---: | :---: | :---: | :---: |
|  |  | 0 | 2.3951 | 0.9307 |
| 1 | 0 | 9.1384 | 0 | 1.2952 |
| 2 | 0.5658 | 0 | 0 | 1.5194 |
| 3 | 0.7548 | 0 | 1.6668 | 2.3976 |
| 4 |  | 0.8105 |  |  |

When the bycatch of red king crab is to be estimated, the $\mathrm{b}_{1}$ coefficients are:

| Quarter | $\underline{b}_{1}$ | $\underline{b}_{2}$ | $\underline{b}_{\mathbf{3}}$ | $\underline{b}_{4}$ |
| :--- | :---: | :---: | :---: | :---: |
|  | 0.2991 | 0 | 0.2931 | 0.2931 |
| 1 | 0.2300 | 0 | 0.4428 | 0.4428 |
| 2 | 0.2671 | 0 | 0.0715 | 0.0715 |
| 3 | 0.9551 | 0 | 0.0641 | 0.0641 |

To check the reliability of these regression coefficients, a comparison was made using the 1989 joint venture data base. Groundfish catches from the joint venture vessels in this fishery were multiplied by the regression coefficients, and prohibited species catch estimates (regression estimates) were made. These

| estimates were then compared to the actual catches of the vessels |
| :--- |
| as reported by U.S. observers. The results are as follows: |
| Species $\frac{\text { Regression estimate }}{}$ <br> Pacific halibut (kg) 489,233 <br> C. bairdi (nos) 205,825 <br> Red king crab (nos) catch  |

## Best Blend Estimator

The best blend procedure for estimating bycatch is based upon the selection of the most appropriate expected bycatch rate for each prohibited species. Once a rate is selected, it is multiplied by the reported DAP groundfish catch to produce an estimate of the bycatch.

The procedure is based upon the assumption that DAP bycatch rates are the same as those experienced by other fisheries targeting the same or similar species. The procedure was implemented as follows:

1) The DAP groundfish data are cumulated by week, target, and subarea. (When subarea is not reported by the vessels, it is assigned based upon catch composition.)
2) Next, the cumulated DAP groundfish data are multiplied by prohibited species rates (PSR) which are selected on the basis of the following criteria:
a) select $P$ SR from the current year's (1989) DAP data for the same week, target, and subarea. If no match (i.e., no DAP prohibited species data for the same week, target, and subarea), then
b) select $P$ SR from current year's (1989) JVP data for the same week, target, and subarea. If no match, then c) select $P S R$ from the current year's DAP data for the same month (monthly average), target, and subarea. If no match, then
d) select PSR from the JVP 3-year (1986-88) historical average for the same month, target, and subarea (no historical subarea data for 516 and 517, so use 511 rate for 516 and 513 rate for 517). If no match, then e) select $P S R$ from the current year's JVP data for the same month (monthly average), target, and subarea. If no match, then
f) select $P S R$ from the current year's DAP data for the same quarter (quarterly average), target, and subarea. If no match, then
3) select PSR from the JVP 3-year historical average for the same quarter (quarterly average), target, and subarea. If no match, then
h) select $P S R$ from the current year's JVP data for the same quarter (quarterly average), target, and subarea. If no match, then
i) select $P S R$ for the current year's DAP data for the year (yearly average), for the same target and subarea. If no match, then

3 select $P S R$ from the JVP 3-year historical average for the year (yearly average), for the same target and subarea. If no match, then
k) select $P S R$ for the current year's JVP data for the year (yearly average), for the same target and subarea. If no match, then

1) examine the data and find a target and subarea likely to have rates similar to the target and subarea in question.

## Groundfish Target Categories

The bycatch management regime requires that the DAP bycatches be separated by target fisheries and zones. At present, the management units are defined as target fisheries for "flatfish" versus that for "other fish," inside Zone 1 (Fig. 1) and outside of Zone 1. This results in four fishery-subarea categories. The following rules were used to assign the weekly catches to the appropriate categories:

1) "DAP flatfish fishery" means DAP fishing operations which retain, on a weekly basis, yellowfin sole, rock sole (Leoidoosetta bilineata), and other flatfish in an amount greater than or equal to $20 \%$ of the total amount of groundfish retained.
2) "DAP other fishery" means DAP fishing operations which retain, on a weekly basis, any combination of groundfish species which does not qualify the fishery as a "flatfish fishery."
3) Catches identified as being taken in area 511 are designated inside Zone 1.
4) Catches not identified as being taken in area 511 are designated outside Zone 1.

The weekly DAP catch data so designated by the four fisherysubarea categories were then multiplied by their corresponding best blend bycatch rates to estimate bycatch in DAP fisheries.

RESULTS
A summary compilation of Zone 1 and outside of Zone 1 bycatches for two major target fisheries (flatfish and other fish) are shown in Tables l-4. Estimates contained in these tables are for DAP fisheries conducted in the eastern Bering Sea through 5 August 1989.

As explained earlier, the robust linear regression estimator is a good predictor of bycatch for Pacific halibut and C. bairdi crab. Therefore, the bycatch of these two species was estimated using the results of the regression analysis. The best blend procedure was used for red king crab, because of the inabilitly of the regression method to accurately predict the 1989 JVP fishery bycatch for this species in the 1989 JVP fishery.

| Species | Qtr 1 | Qtr 2 | Qtr 3 | Total |
| :---: | :---: | :---: | :---: | :---: |
| Pacific halibut (kg) | 133,114 | 3,924 | 0 | 137,038 |
| C. bairdi (nos.) | 63,339 | 789 | 0 | 64,128 |
| Red king crab (nos.) (regression estimate) | 23,822 | 600 | 0 | 24,422 |
| Red king crab (nos.) (best blend estimate) | $64,714$ | 1,440 | 0 | 66,154 |

Table 2.-- Estimates of the prohibited species catches (through 5 August 1989) in the domestic annual processing other fish fishery inside Zone 1..

| Species | Qtr 1 | Qtr 2 | Qtr 3 | Total |
| :--- | :---: | :---: | ---: | ---: |
| Pacific halibut (kg) | 72,474 | 184,345 | 42,766 | 299,586 |
| C. bairdi (nos.) | 13,015 | 70,949 | 4,464 | 88,428 |
| Red king crab (nos.) <br> (regression estimate) | 3,082 | 3,500 | 1,408 | 7,990 |
| Red king crab (nos.) <br> (best blend estimate) | 3,045 | 11,244 | 10,300 | 24,589 |

Table 3.-- Estimates of the prohibited species catches (through 5 August 1989) in the domestic annual processing flatfish fishery outside Zone 1.

| Species | Qtr 1 | Qtr 2 | Qtr 3 | Total |
| :--- | ---: | ---: | ---: | ---: |
| Pacific halibut (kg) | 19,979 | 280 | 74 | 20,332 |
| C. bairdi (nos.) | 7,863 | 65 | 131 | 8,059 |
| Red king crab (nos.) <br> (regression estimate) | 2,468 | 20 | 8 | 2,496 |
| Red king crab (nos.) <br> (best blend estimate) | 85 | 1 | 4 | 90 |

Table 4.-- Estimates of the prohibited species catches (through 5 August 1989) in the domestic annual processing other fish fishery outside Zone 1.

| Species | Qtr 1 | Qtr 2 | Qtr 3 | Total |
| :--- | ---: | ---: | ---: | ---: | ---: |
| Pacific halibut (kg) | 159,523 | 615,922 | 245,852 | $1,020,896$ |
| C. bairdi (nos.) | 25,307 | 188,485 | 38,023 | 251,815 |
| Red king crab (nos.) <br> (regression estimate) | 3,428 | 21,702 | 17,673 | 42,803 |
| Red king crab (nos.) <br> (best blend estimate) | 34 | 54 | 1,041 | 1,129 |



## REFERENCES

Kappenman, Russell. 1988. Robust symmetric distribution location estimation and regression. J. Stat. Plan. Infer. 19:55-72.

