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Catch per unit effort (CPUE) analysis of the Campbell Island Rise southern blue whiting (Micromesistius australis) trawl fishery from 1986 to 1993

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# Catch per unit effort (CPUE) analysis of the Campbell Island Rise southern blue whiting (Micromesistius australis) trawl fishery from 1986 to 1993 

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## 1. EXECUTIVE SUMMARY

Standardised CPUE analysis of the Campbell Island Rise southern blue whiting (SBW) trawl fishery from 1986 to 1993 is described using three separate models. The models were a lognormal linear (LNL) model, and two generalised linear models - a gamma log-link (GLL) model and a delta lognormal (DLN) model. Catch-effort data came from the fishery statistics database and included all tows ( $n=6971$ ) within an area south of $50^{\circ} 30^{\prime} \mathrm{S}$ and north of $53^{\circ} 30^{\prime} \mathrm{S}$, and east of $168^{\circ} 30^{\prime} \mathrm{E}$ and west of $172^{\circ} 00^{\prime}$ E that targeted SBW or caught SBW or both. A total of 17 variables, either continuous or categorical, was used in all 3 models. The measure of CPUE was catch ( kg ) per n . mile.

A stepwise multiple regression procedure was used to fit the LNL model. Five variables were entered into the model, the most significant being year. The overall trend of the relative year effects from 1986 to 1992 was downwards, though there were small increases in 1989 and 1991. The index showed a marked increase from 1992 (0.07) to 1993 (0.47). Examination of plots of residuals and observed versus expected values indicated a poor fit of the model to the data.

Seven variables were selected into the GLL model using a stepwise procedure. The trajectory of the relative year effects from 1986 to 1992 was similar to that from the LNL model except the downward trend was monotonic. Again the index showed a sharp increase from 1992 (0.24) to 1993 (0.70). Plots of residuals and observed versus expected values indicated a much stronger fit of this model to the data, than of the LNL model. The GLL model was relatively insensitive to possible errors in high CPUE values.

The CPUE index given by the DLN model was calculated by combining results from two separate analyses; a GLL model of all successful (non-zero catch) tows and a binomial model (similar in structure to the GLL model) of the proportion of zero catches in each year. The combined index was very similar to the GLL index.

The Middle Depths Fishery Assessment Working Group recommended that the GLL index be used to tune the Virtual Population Analysis of the Campbell Island Rise stock because it gave a better fit to the data and handled zero tows in a more plausible way than the LNL model, and was relatively insensitive to potential errors in the dataset. The DLN model looks promising but requires further development.

## 2. INTRODUCTION

The southern blue whiting (SBW) trawl fishery is concentrated mainly on the August and September spawning aggregations on the Pukaki Rise and Bounty Platform, and near the Campbell Islands (Annala 1994). During the 1980s most SBW landings were taken from the Campbell Island spawning grounds. However, over the last 3 years large catches have also come from Bounty Platform and Pukaki Rise (Annala 1994).

The 1993 fishery assessment of the Campbell Island stock (Hanchet 1993) used catch-at-age data from 1986 to 1992 in a Virtual Population Analysis (VPA). The VPA was tuned using total effort standardised on a Soviet Atlantic class CPUE index. However, concerns were raised by the Middle Depths Fishery Assessment Working Group that the estimates of current biomass derived from the VPA were imprecise and negatively biased because of problems with the final point of the CPUE index (Hanchet 1993). The group recommended that a standardised CPUE analysis be carried out using a linear model that modelled the year effect after excluding other effects such as season, vessel size, and nation.

This paper describes the calculation of standardised CPUE indices for the period 1986 to 1993 using a lognormal linear (LNL) model and two generalised linear models; a gamma distribution, log-link function (GLL) model, and a delta-lognormal (DLN) model of the type described by Vignaux (1994).

## 3. THE DATA

### 3.1 Source of catch-effort data

The catch-effort data came from the fishery statistics database managed by the Information Technology Directorate. Records from all commercial tows made in August and September from 1986 to 1993 in the area south of latitude $50^{\circ} 30^{\prime} \mathrm{S}$ and east of longitude $168^{\circ} 30^{\prime} \mathrm{E}$ and from all tows outside this region that targeted SBW, or caught SBW, or did both during the same period were extracted. This selection ensured that all tows made in the Campbell Island fishery that did not catch SBW ("zero catches") and tows either catching SBW, or targeting SBW, or doing both within the Campbell Island area but with wrongly recorded or mis-typed position coordinates were included in the dataset. The final boundaries used for the Campbell Island fishery enclosed an area south of $50^{\circ} 30^{\prime} \mathrm{S}$ and north of $53^{\circ} 30^{\prime} \mathrm{S}$, and east of $168^{\circ} 30^{\prime} \mathrm{E}$ and west of $172^{\circ} 00 \mathrm{E}$ (Figure 1). All tows remaining outside this area after error checking (see Section 3.3), were deleted.

### 3.2 Contents

The following information was available for each tow.
Vessel identification number
Estimated catch (kg) of SBW

## Date

Time at start of tow
Time at end of tow
Duration of tow (h)
Speed of tow (knots)
Distance of tow (n. miles)
Latitude (decimal degrees) at start of tow
Longitude (decimal degrees) at start of tow
Depth of groundrope (m) at start of tow
Depth of bottom (m) at start of tow
Headline height of net (m)
Target species

### 3.3 Error checks and data editing

The error checking procedures used on these data were similar to those described by Vignaux (1993). Briefly, if the cause of the anomaly was clear the record was altered so that it was consistent with adjacent records and other information on the tow (e.g., gear type, position of tow, bottom depth). Otherwise, the original paper record (i.e., the Trawl, Catch, Effort and Processing Return) was examined to determine the cause of the error, or if the tow had been witnessed by a fisheries observer then their records were compared. If the error was still not resolved, the tow was deleted. A summary of types and number of errors found and the proportion corrected is presented in Table 1.

Table 1: Number of errors associated with the following factors and the proportion able to be corrected

| Factor | No. of errors | \% corrected |
| :--- | ---: | ---: |
|  |  |  |
| Groundrope depth | 177 | 26 |
| Tow position | 49 | 100 |
| Date of tow | 48 | 100 |
| Speed of tow | 31 | 100 |
| Headline height | 41 | 100 |
| Bottom depth | 21 | 100 |
| Duplicate records | 24 | 92 |
| Start/end time | 16 | 31 |
| Catch (very big) | 15 | 100 |
|  |  |  |
| Total | 422 | 66 |

After examination of the dataset, all 10 tows carried out in less than 300 m or over 610 m bottom depth within the area were deleted. These tows typically had a zero or very small SBW catch and were often targeting different species.

At the start of the 1991 fishing season MAF changed the definitions of the "Start time" and "End time" of a tow to be the times that the net went into the water and the time that it left the water, respectively. The original definitions were the times that the net reached fishing depths and that hauling began. Vignaux (1993) found, however, that only
$30 \%$ of vessels in the hoki fleet used the new definition in the 1991 and 1992 fishing years. To avoid a downwards bias to these years of hoki CPUE, Vignaux eliminated all data from companies which used the new definition. The vessel (and company) composition of the SBW and hoki fishery in any one year is very similar (S. Hanchet, NIWA Greta Point, pers. comm.), so all SBW data from companies using the new definition in 1991 and 1992 were likewise excluded. Vignaux (1993) found no evidence of bias in the 1991 and 1992 year indices for hoki CPUE as a result of eliminating data from these companies. Hanchet (1993) also found that inclusion or exclusion of these tows made very little difference to his unstandardised CPUE indices. At the start of the 1993 season MAF changed the start and end time definitions back to their original meaning.

All tows that were not targeting SBW but were made at the same time of year in the same area at similar bottom depths (between 300 and 600 m ) and with similar gear to the SBW fishery were examined carefully. These tows ( 67 in total) were targeting species such as hoki (23), ling (40), and orange roughy (3). Of these tows, 21 were deleted on the basis that the vessel either did not catch any SBW in these tows, or did not target SBW at any stage during the season, or the tows occurred at the beginning or end of the SBW season. The remaining tows, although not targeting SBW, often caught large quantities of SBW (up to 50138 kg ), or occurred during the middle of the SBW season, or both.

### 3.4 Zero catches

Initial examination of the "un-groomed" CPUE (catch per n. mile) data showed that for all years combined $8.7 \%$ had zero catches. Having a dataset with such a large proportion of zeros presents two problems when using parametric techniques such as the lognormal linear model. Firstly, the statistical distribution of the dataset may be distorted to such an extent that the assumptions of normality and equality of variances, which are implicit in the valid use of such models, may not be satisfied even after data transformation. Secondly, because there is a direct logarithmic transformation of CPUE a small constant must be added to avoid taking the logarithm of zero. Similar analyses have shown, however, that results can be sensitive to the value of this arbitrary constant (Porch \& Scott 1992, Vignaux 1993). (In the gamma and delta lognormal models, zero data values are treated in different ways, as described below, compared to the lognormal linear model so the proportion of zero catches is not as problematic.) In an effort to reduce the number of zeros, and therefore minimise the above problems when running the lognormal linear model, several steps were taken.
(1) All tows which were 30 min or less in duration and in which no SBW were caught were deleted. These short unsuccessful tows were assumed to result from problems with the gear during shooting of the net. This eliminated 31 (5\%) of the zero catches.
(2) Where possible, zero catches were compared with equivalent observer data. A total of 34 (5.5\%) of the zero catches were recorded as non-zero catches by observers. For these tows the observer recorded catch was entered instead of the original estimated zero catch.
(3) Tows with a net depth of less than 100 m and zero SBW catch were
deleted. This eliminated $1(0.2 \%)$ of the zero tows.
The constant added to all CPUE values was 0.05 kg , giving (CPUE +0.05 ). The final distribution for the logarithmic transformed data is shown in Figure 2.

### 3.5 Summary of tow data

Table 2 gives the number of vessels providing tow data, number of tows, and number of zero catches in each year in the final "groomed" dataset. The start position of all 6971 tows is shown in Figure 1.

Table 2: Summary of "groomed"Campbell Island SBW CPUE data

| Year | '86 | '87 | '88 | '89 | '90 | '91 | '92 | '93 | Total |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| No. of vessels | 15 | 17 | 15 | 23 | 33 | 28 | 33 | 20 |  |
| No. of tows | 893 | 663 | 843 | 1008 | 1005 | 1057 | 1091 | 411 | 6971 |
| Zero catches (\%) | $\begin{array}{r} 41 \\ (4.6) \end{array}$ | $\begin{array}{r} 35 \\ (5.3) \end{array}$ | $\begin{array}{r} 60 \\ (7.1) \end{array}$ | $\begin{array}{r} 47 \\ (4.7) \end{array}$ | $\begin{array}{r} 78 \\ (7.8) \end{array}$ | $\begin{array}{r} 39 \\ (3.7) \end{array}$ | $\begin{array}{r} 204 \\ (18.7) \end{array}$ | $\begin{array}{r} 44 \\ (10.7) \end{array}$ | $\begin{array}{r} 548 \\ (7.9) \end{array}$ |

### 3.6 Vessel data

The vessel data came from the vessel registration database and the Lloyds Register (Lloyds 1990). The following information was obtained for each vessel.

Nationality of vessel
Overall length (m)
Gross tonnage
Year built
Breadth of vessel (m)
Draught of vessel (m)
Company vessel was registered to in each of the years from 1986 to 1993
Processing capability and engine power were not used as variables because of the unreliability of this data. For example, in 1992 and 1993 some surimi vessels were not converting fish into surimi, but head and gutting instead. Also information from industry and observers indicated that some vessels had the ability to "gear-up" with extra power in excess of that registered, if required, through the use of auxiliary generators. The exact power capacity of some boats is, as yet, unknown. Until reliable data can be collected on these two variables they will be excluded from the CPUE analysis.

## 4. THE VARIABLES

The variables used in all three models were either continuous or categorical (Table 3). Categorical variables included year, tow positions, end time, start time, headline height,
and vessel nation, and were included in the models with the constraint that the sum of the regression coefficients should be zero. Continuous variables were included up to a cubic power.

Table 3: Summary of variables used in CPUE models. cont $=$ continuous variable, cat $=$ categorical variable with a given number of categories

| Variable | Type | Description |
| :--- | :--- | :--- |
| Year | cat 8 | Year in which tow occurred |
| Tow position | cat 4 | Position at start of tow $($ see text $)$ |
| End time cat 6 | Time of end of tow in 4 h periods $(\mathrm{eg}, 0001-0400 \mathrm{~h})$ <br> Start time | cat 6 |

The year of the tow is included as a categorical value which allows the regression coefficients of each year to vary independently. Relative year effects can be calculated from these regression coefficients (after Doonan 1991):

$$
\hat{A}_{i}=\exp \left(\hat{Y}_{i}-\hat{Y}_{I 986}\right)
$$

where $\hat{Y}_{i}$ is the year coefficient for year $i, \hat{Y}_{1986}$ is the year coefficient for 1986, and $\hat{A}_{i}$ is the estimate of the year effect in year $i$ relative to the year effect in 1986. The variance of this estimate is;

$$
S_{A i}^{2}=\hat{A}_{i}{ }^{2} \exp \left(\sigma^{2}\right)\left[\exp \left(\sigma^{2}\right)-1\right]
$$

where;

$$
\sigma^{2}=\operatorname{Var}\left(\hat{Y}_{i}\right)+\operatorname{Var}\left(\hat{Y}_{1986}\right)-2 \operatorname{Cov}\left(\hat{Y}_{i}, \hat{Y}_{1986}\right)
$$

The relative year effects represent the changes in CPUE over time, all other effects having been taken into account, and therefore represent an index of abundance.

Tow position is a categorical variable in which the start position of each tow has been assigned to one of four area strata (Figure 3). The strata are based on the typical fishing pattern of the fleet and the main spawning sites within the Campbell Island Rise
fishery: 1 is a northern area fished at the beginning of the season; 2 is the northern spawning ground; 3 is an area often fished at the end of the spawning season; and 4 is the southern spawning ground. Plots of CPUE against each stratum showed that there were apparent differences in catch per unit effort between areas (Figure 4a).

The end time and start time of each tow were separated into 4 h periods (i.e., 0001 to $0400 \mathrm{~h}, 0401$ to 0800 h , and so on), thus creating categorical variables, after preliminary analysis had shown a possible diel pattern in CPUE. A plot of $\log$ (CPUE + 0.05 ) against end time is shown as an example (Figure 4b).

Season is a continuous variable based on the day relative to the date at which $10 \%$ of the fish were actively spawning for the first time that year. The season midpoint (i.e., $10 \%$ of fish spawning) has a value of 0 , the days before the midpoint $=-1,-2,-3, \ldots$, and the days after the midpoint $=+1,+2,+3$, etc. Gonad staging data from fisheries observers were used to determine the season midpoint (Hanchet 1993). CPUE reaches a peak about 2 days before the middle of the season (Figure 4c), then declines quite sharply before showing a steady increase from about day +9 . The late season increase may coincide with the time of second spawning which typically follows the first spawning by about 2 weeks, but is a much smaller event (Hanchet 1993).

Headline height was separated into four groups (Table 3) based on preliminary analysis of CPUE data and type of net used for the tow. CPUE appeared to increase with increasing headline height before reaching a plateau at between 40 and 75 m (Figure 4d). Catch effort decreased as net openings exceeded 75 m . The $0-15 \mathrm{~m}$ category was included as the likely range of headline heights for bottom trawl gear. Net openings over 15 m probably came from midwater trawl gear.

## 5. THE MODELS

The measure of CPUE used in all models was catch ( kg ) per n . mile. Other studies (Doonan 1991, Hanchet 1991, Vignaux 1992), have shown that catch per nautical mile gives a more consistent measure of effort than catch per tow or catch per day which can be confounded by factors such as change in length of tow time between years and processing time limitations.

### 5.1 Lognormal linear (LNL) model

The LNL model was similar to the multiple regression model described by Doonan (1991) and Vignaux (1992). The model was of the form:

$$
\log \left(C P U E_{t}+0.05\right)=M+Y_{i t}+A_{j t}+B_{k t}+D_{l t}+\ldots+\varepsilon_{t}
$$

or, equivalently

$$
\left(C P U E_{t}+0.05\right)=\exp (M)^{*} \exp \left(Y_{i j}\right)^{*} \exp \left(A_{j i}\right) * \exp \left(B_{k}\right)^{*} \exp \left(D_{l i}\right)^{*} \ldots * \exp \left(\varepsilon_{1}\right)
$$

where $\left(C P U E_{t}+0.05\right)$ is the catch per unit effort for a particular tow $t, M$ is an overall
mean for $\log \left(C P U E_{t}+0.05\right), Y_{i t}$ is the effect on $\log \left(C P U E_{t}+0.05\right)$ of tow $t$ being in the $i$ th year, $A_{j t}$ is the effect of variable $A$ having value $j, B_{k t}$ is the effect of variable $B$ having value $k, D_{l,}$ is the effect of variable $D$ having value $l$, and so on. $\varepsilon$, is the error in $\log \left(C P U E_{1}+0.05\right)$, with zero mean and independently normally distributed.

A stepwise procedure was used in constructing the model. At the first iteration all main effects were regressed individually against the CPUE estimate and the one explaining the most variation, that is giving the highest $R^{2}$, was selected as the first variable in the model. In the second iteration, all main effects plus the first selected variable were again fitted separately and the one giving the most improvement in $R^{2}$ was added to the model. This procedure continued until the inclusion of an additional variable in the model led to a less than $1 \%$ improvement in $R^{2}$.

Five variables were entered into the model (Table 4), with the most significant being year. The overall trend of the relative year effects from 1986 to 1992 was downwards, although there were small increases in 1989 and 1991 (Table 5, Figures 5 and 6). The index showed a marked increase from 1992 (0.07) to 1993 (0.47). The index appears to be influenced by the proportion of zero tows in each year: when the percentage of zero catches increases the index falls, and vice versa.

The pattern of the residuals calculated from the final model was non-random (Figure 7a) and a plot of observed CPUE values against fitted values showed a poor correlation, especially for zero data values (Figure 7b). These diagnostic features indicate a weak fit of the linear model to the log transformed data.

Table 4: Lognormal linear (LNL) model. Choice of variables, in order of importance, in regression against $\log (\mathrm{CPUE}+\mathbf{0 . 0 5})$ for data from 1986 to 1993. cat $=$ categorical variable

|  |  |  |  |  | $R^{2}$ at iteration |  |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | :---: |
|  | 1 | 2 | 3 | 4 | 5 | 6 |  |
| Variable |  |  |  |  |  |  |  |
|  | 7.86 |  |  |  |  |  |  |
| Year | 1.97 | 9.21 |  |  |  |  |  |
| Tow position | 9.15 | 10.49 |  |  |  |  |  |
| End time | 1.56 | 9.05 | 10.23 | 11.55 |  |  |  |
| Season | 1.72 | 8.72 | 10.09 | 11.40 | 12.55 |  |  |
| Vessel nation |  |  |  |  |  |  |  |
|  | 1.53 | 8.86 | 9.95 | 11.22 | 12.29 | 13.28 |  |
| Bottom depth | 0.30 | 8.29 | 9.67 | 10.97 | 12.03 | 13.08 |  |
| Target species | 0.73 | 8.50 | 9.87 | 11.19 | 12.25 | 12.99 |  |
| Vessel breadth | 0.67 | 8.31 | 9.55 | 10.94 | 11.88 | 12.87 |  |
| Net depth | 0.95 | 8.88 | 10.28 | 10.66 | 11.72 | 12.73 |  |
| Start time | 1.20 | 8.29 | 9.62 | 10.91 | 11.94 | 12.74 |  |
| Year vessel built | 1.00 | 8.53 | 9.91 | 11.23 | 12.30 | 12.97 |  |
| Vessel 1*b*d | 1.9 .9 |  |  |  |  |  |  |
| Vessel draught | 0.94 | 8.46 | 9.85 | 11.16 | 12.25 | 12.95 |  |
| Vessel length | 0.20 | 8.41 | 9.74 | 11.09 | 12.15 | 12.87 |  |
| Headline height | 0.17 | 7.98 | 9.37 | 10.69 | 11.69 | 12.70 |  |
| Vessel tonnage | 0.24 | 8.35 | 9.66 | 11.00 | 12.08 | 12.88 |  |
| Vessel company | 1.30 | 7.88 | 9.24 | 10.53 | 11.56 | 12.56 |  |
|  |  |  |  |  |  |  |  |
| Polynomial | cat | cat | cat | 3 | cat |  |  |
| Improvement (\%) |  | 1.35 | 1.28 | 1.06 | 1.00 | 0.73 |  |

Table 5: Relative year effects $\hat{A}_{i}$ from the lognormal linear (LNL) model of CPUE for the period 1986 to 1993. $R$ are the regression coefficients of the year variable, s.e. are the standard errors of these coefficients in the regression, and Cov. is the covariance between the coefficients and the coefficient of the base year (1986). $\hat{A}_{i}$ is the relative year effect and $s_{i i}$ is the standard error of the year effect

| Year | $R$ | s.e | Cov. | $\hat{A}_{i}$ | $s_{\text {Ai }}$ |
| ---: | ---: | ---: | ---: | ---: | ---: |
|  |  |  |  |  |  |
| 1986 | 0.868 | 0.094 | 0.009 | 1.000 | 0.000 |
| 1987 | 0.354 | 0.106 | -0.001 | 0.598 | 0.090 |
| 1988 | 0.196 | 0.096 | -0.001 | 0.511 | 0.071 |
| 1989 | 0.537 | 0.088 | -0.001 | 0.718 | 0.097 |
| 1990 | -0.361 | 0.096 | -0.002 | 0.293 | 0.043 |
| 1991 | 0.114 | 0.119 | -0.002 | 0.470 | 0.080 |
| 1992 | -1.824 | 0.093 | -0.001 | 0.068 | 0.009 |
| 1993 | 0.115 | 0.134 | 0.001 | 0.471 | 0.075 |

### 5.2 Gamma, with log-link function (GLL) model

The GLL model procedure has been described in detail by Vignaux (1994). Briefly, it attempts to fit a linear model to the CPUE data in its original form. This is in contrast to the usual parametric procedure of fitting a model to data that has been transformed (e.g., $\log ($ CPUE +0.05$)$ ) to meet assumptions of normality and equality of variances, as in the LNL model. Initially, the raw data are transformed using a logarithmic function and a linear model is calculated. A set of linear predicted (expected) values is then generated and back-transformed using a link function. The difference between the expected and observed data values is then modelled using a distribution similar to the known nature of the data, in this instance a gamma error distribution (variance proportional to the square of the mean), and a residual deviance calculated. The model attempts to minimise the residual deviance by changing the parameters of the linear model. Because expected and observed values are compared in untransformed space, zero data values can be left in the model and no arbitrary replacement is required.

A stepwise procedure similar to that used for the LNL model was used to calculate the full GLL model. The procedure continued until the addition of an extra variable led to a less than $1 \%$ improvement in the deviance explained compared to the null deviance, which is analogous to the sum of squares of the errors in a linear model.

Seven variables were selected into the GLL model (Table 6). Year was again the most significant, followed by vessel nation, tow position, end time, net depth, vessel tonnage and season. Net depth and vessel tonnage were the two extra variables to enter this model compared to the LNL model. The trajectory of the relative year effects from 1986 to 1992 was similar to that shown by the LNL model except the downward trend was monotonic (Table 7, Figures 8, 9, and 10). Again the index showed a sharp increase from 1992 to 1993.

Plots of residuals (Figure 7c) and observed versus fitted values (Figure 7d) indicated that the GLL model fitted the CPUE data better than the LNL model. The residuals showed a more random distribution, and there was a better correlation between the expected and observed values.

Because the GLL model is fitted in untransformed space the indices scale as the arithmetic mean of the CPUE values rather than the geometric means, as with the LNL model. As a result, the GLL model can be more sensitive to errors in the data in the high CPUE tail of the distribution (Vignaux 1994). To test for this, a sensitivity analysis was done in which all CPUE values over 10000 (about $1 \%$ of data) were removed from the dataset and both the LNL and GLL models recalculated. Comparison of the indices from the full dataset and from the dataset less the high extremes showed greater differences for the GLL model than the LNL model, but the overall pattern remained the same (Figure 11). The relatively small change in the indices suggests that, for this dataset, the GLL model may not be very sensitive to any remaining errors in high catch effort values.

Table 6: Gamma, log link function (GLL) model. Choice of variables, in order of importance, in model of CPUE data from 1986 to 1993. cat = categorical variable

| Variable | 1 | 2 | 3 | 4 | 5 | 6 | 7 |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | ---: |
|  |  |  |  |  |  |  |  |
| Year | 8431 |  |  |  |  |  |  |
| Vessel nation | 8533 | 8144 |  |  |  |  |  |
| Tow position | 8686 | 8240 | 7965 |  |  |  |  |
| End time | 8717 | 8256 | 7968 | 7776 |  |  |  |
| Net depth | 8708 | 8292 | 8007 | 7806 | 7547 |  |  |
| Vessel tonnage | 8770 | 8178 | 7995 | 7831 | 7614 | 7388 |  |
| Season | 8640 | 8297 | 7998 | 7802 | 7602 | 7402 | 7250 |
|  |  |  |  |  |  |  |  |
| Headline height | 8793 | 8295 | 8010 | 7825 | 7621 | 7424 | 7298 |
| Start time | 8726 | 8255 | 7973 | 7777 | 7731 | 7485 | 7323 |
| Year vessel built | 8845 | 8376 | 8122 | 7954 | 7762 | 7530 | 7366 |
| Vessel breadth | 8687 | 8169 | 8000 | 7826 | 7619 | 7390 | 7372 |
| Vessel length | 8736 | 8179 | 8023 | 7859 | 7655 | 7414 | 7380 |
| Bottom depth | 8831 | 8434 | 8143 | 7946 | 7764 | 7540 | 7380 |
| Vessel I*b*d | 8674 | 8183 | 8026 | 7853 | 7655 | 7437 | 7382 |
| Vessel draught | 8689 | 8228 | 8068 | 7892 | 7698 | 7486 | 7366 |
| Vessel company | 8726 | 8422 | 8135 | 7955 | 7758 | 7533 | 7387 |
| Target species | 8943 | 8497 | 8197 | 8020 | 7825 | 7601 | 7443 |
| Polynomial |  |  |  |  |  |  |  |
| Improvement | cat | cat | cat | cat | 3 | 3 | 3 |

Table 7: Relative year effects $\hat{\boldsymbol{A}}_{i}$ from the gamma, log-link (GLL) model of CPUE for the period 1986 to 1993. $R$ are the regression coefficients of the year variable, s.e. are the standard errors of these coefficients in the regression, and Cov. is the covariance between the coefficients and the coefficient of the base year (1986). $\hat{A}_{i}$ is the relative year effect and $s_{\hat{i} i}$ is the standard error of the year effect

| Year | $R$ | s.e | Cov. | $\hat{A}_{i}$ | $s_{i i}$ |
| :--- | ---: | ---: | ---: | ---: | ---: |
|  |  |  |  |  |  |
| 1986 | 0.652 | 0.051 | 0.002570 | 1.000 | 0.000 |
| 1987 | 0.186 | 0.057 | -0.000421 | 0.627 | 0.049 |
| 1988 | 0.106 | 0.051 | -0.000006 | 0.579 | 0.042 |
| 1989 | -0.018 | 0.058 | -0.000588 | 0.512 | 0.041 |
| 1990 | -0.121 | 0.051 | -0.000358 | 0.462 | 0.036 |
| 1991 | -0.326 | 0.063 | -0.000623 | 0.376 | 0.033 |
| 1992 | -0.781 | 0.053 | -0.000526 | 0.238 | 0.019 |
| 1993 | 0.301 | 0.076 | 0.000518 | 0.704 | 0.061 |

### 5.3 Delta lognormal (DLN) model

A second generalised linear model, the DLN model (Vignaux 1994), was also used to determine annual changes in CPUE. This model has the same advantage as the GLL model in that it avoids introducing an arbitrary constant to cope with zero catches. The model is made up of two parts. A GLL model of the catch rate of successful (non-zero) tows and a binomial model of the proportion of zero catches. The GLL model determines how the catch rate of non-zero tows has changed from year to year, while the binomial model determines how the success rate (i.e., presence/absence of SBW in tows) has changed from year to year. A combined index is calculated in which the year effects from the GLL model are combined with the year effects from the binomial model.

### 5.3.1 GLL model of catch rate of successful tows

The catch rate of successful tows, with all zero tows excluded, was modelled using a gamma distribution and a log link function. Seven variables were included in the model (Table 8). These variables were identical to those included in the GLL model for all tows (see Table 6), and they entered the model in the same order. The CPUE indices calculated for both models were very similar (Table 9).

### 5.3.2 Binomial model of proportion of zero catches

A binomial model was used to model the proportion of zero catches. The response variable was 1 if the catch was zero, and 0 otherwise. Four variables were included in the model (Table 10) and the index calculated showed the same pattern as the proportion of zero tows in each year, relative to 1986 (see Table 9).

### 5.3.3 Combining the GLL and binomial models

The method for combining the two indices is described in full in appendix 3 of

Vignaux (1994). The combined index differs little from the one given by the GLL model (see Table 9, Figure 10). The index decreased montonically from 1986 to a low of 0.23 in 1992 and then increased sharply to 0.69 in 1993.

Table 8: Delta lognormal (DLN) model. Choice of variables, in order of importance, in gamma, log link function model run on non-zero tows only. CPUE data from 1986 to 1993

Residual deviance at iteration

| Variable | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  |  |  |  |
| Year | 9464 |  |  |  |  |  |  |  |
| Vessel nation | 9580 | 9174 |  |  |  |  |  |  |
| Tow position | 9734 | 9269 | 8992 |  |  |  |  |  |
| End time | 9767 | 9286 | 8996 | 8806 |  |  |  |  |
| Net depth | 9759 | 9323 | 9035 | 8832 | 8571 |  |  |  |
| Vessel tonnage | 9821 | 9210 | 9023 | 8856 | 8642 | 8411 |  |  |
| Season | 9690 | 9328 | 9025 | 8825 | 8622 | 8423 | 8271 |  |
|  |  |  |  |  |  |  |  |  |
| Headline height | 9844 | 9327 | 9039 | 8853 | 8644 | 8448 | 8320 | 8193 |
| Target species | 9879 | 9413 | 9110 | 8930 | 8733 | 8509 | 8351 | 8209 |
| Start time | 9777 | 9287 | 9001 | 8802 | 8755 | 8509 | 8346 | 8209 |
| Year vessel built | 9894 | 9407 | 9150 | 8979 | 8785 | 8553 | 8388 | 8243 |
| Vessel breadth | 9737 | 9199 | 9028 | 8851 | 8646 | 8413 | 8395 | 8258 |
| Vessel length | 9787 | 9211 | 9051 | 8884 | 8677 | 8447 | 8402 | 8259 |
| Bottom depth | 9875 | 9461 | 9166 | 8968 | 8784 | 8559 | 8398 | 8261 |
| Vessel l*b*d | 9723 | 9213 | 9054 | 8879 | 8678 | 8460 | 8405 | 8266 |
| Vessel draught | 9741 | 9258 | 9097 | 8917 | 8721 | 8510 | 8408 | 8268 |
| Vessel company | 9776 | 9454 | 9164 | 8981 | 8781 | 8556 | 8410 | 8271 |
|  |  |  |  |  |  |  |  |  |
| Percent improvement | 2.9 | 1.9 | 1.9 | 2.3 | 1.6 | 1.5 | 0.7 |  |

Table 9: The proportion of zero tows, the proportion relative to the 1986 value, the indices from the GLL model, the no zeroes GLL model, the binomial model and the DLN model. s.e. = standard error

| Year | Proportion of zeroes <br> Raw | GLL model <br> Relative | GLL model <br> No zeroes | Binomial <br> model | DLN <br> model (s.e.) |  |
| :--- | :---: | ---: | ---: | ---: | ---: | ---: |
| 1986 | 0.046 | 1.00 | 1.00 | 1.00 |  | 1.00 |
| 1987 | 0.053 | 1.15 | 0.63 | 0.65 | $1.00(0.05)$ |  |
| 1988 | 0.071 | 1.54 | 0.58 | 0.61 | 1.79 | $0.63(0.04)$ |
| 1989 | 0.047 | 1.02 | 0.51 | 0.52 | 1.29 | $0.52(0.04)$ |
| 1990 | 0.078 | 1.70 | 0.46 | 0.51 | 2.28 | $0.48(0.04)$ |
| 1991 | 0.037 | 0.80 | 0.38 | 0.38 | 1.05 | $0.37(0.03)$ |
| 1992 | 0.187 | 4.07 | 0.24 | 0.29 | 7.12 | $0.23(0.02)$ |
| 1993 | 0.107 | 2.33 | 0.70 | 0.75 | 3.04 | $0.69(0.07)$ |

Table 10: Delta lognormal (DLN) model. Choice of variables, in order of importance, in binomial model. CPUE data from 1986 to 1993

Residual deviance at iteration

| Variable | 1 | 2 | 3 | 4 | 5 |
| :--- | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  |
| Year | 3633 |  |  |  |  |
| Bottom depth | 3776 | 3583 |  |  |  |
| Vessel nation | 3791 | 3598 | 3539 |  |  |
| Season | 3804 | 3602 | 3553 | 3502 |  |
|  |  |  |  |  |  |
| End time | 3813 | 3608 | 3557 | 3512 | 3477 |
| Vessel draught | 3797 | 3601 | 3543 | 3522 | 3484 |
| Tow position | 3798 | 3598 | 3569 | 3526 | 3487 |
| Vessel l*b*d | 3790 | 3599 | 3540 | 3524 | 3488 |
| Vessel length | 3822 | 3618 | 3564 | 3524 | 3489 |
| Vessel breadth | 3805 | 3603 | 3545 | 3525 | 3489 |
| Year vessel built | 3803 | 3616 | 3564 | 3527 | 3491 |
| Start time | 3829 | 3622 | 3571 | 3528 | 3492 |
| Target species | 3830 | 3622 | 3572 | 3528 | 3492 |
| Vessel tonnage | 3827 | 3625 | 3572 | 3532 | 3496 |
| Headline height | 3826 | 3618 | 3568 | 3535 | 3498 |
| Vessel client | 3810 | 3632 | 3581 | 3535 | 3500 |
| Net depth | 3828 | 3622 | 3575 | 3535 | 3500 |
|  |  |  |  |  |  |
| Percent improvement | 1.3 | 1.2 | 1.0 | 0.7 |  |

## 6. DISCUSSION

This analysis of CPUE in the Campbell Island Rise SBW fishery gives a number of improvements compared with that done by Hanchet (1993). Firstly, all data from all vessel types and nations were used; secondly, zero tows were included; and lastly, the CPUE analysis was standardised which allowed the relative year effects to be modelled after removing the effect of other significant variables.

After evaluating the three different models, the Middle Depths Fishery Assessment Working Group recommended that the GLL model index be used to tune the VPA model because it

- gives a much better fit to the CPUE data than does the LNL model;
- deals with zero tows in a more plausible way;
- was relatively insensitive to potential errors in the dataset; and
- has become widely used in fisheries assessment and its methodology is well understood (Porch \& Scott 1992). The DLN model is a more recent generalised linear model that has not yet been fully developed. The Working Group did suggest, however, that the sensitivity of the VPA analysis to the DLN CPUE index be tested.

There are some improvements that could be considered for next year's CPUE analysis. The effect of interactions on the various models could be examined, though interpretation of such effects can be difficult (Vignaux 1994). Inclusion of a power variable for vessel may also be useful, if accurate data can be obtained. Also, further developments of the DLN model may eventually make this a more appropriate model to use. Given the increasing proportion of zero tows occurring in the fishery, such a model is intuitively more appealing because it determines the change in annual CPUE by separate analysis of the successful tows and the proportion of unsuccessful tows.

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Figure 1: Map of tows used in CPUE analysis, 1986-1993.


Figure 2: Histogram of $\log (C P U E)$ with the arbitary zero replacement catch set to 0.05 kg .


Figure 3: Start positions of tows and area strata used in the CPUE analysis, 1986-93.


Figure 4. Plots of $\log (C P U E+0.05)$ against; $(A)$ tow position strata, $(B)$ end time of tow, $(C)$ season, and (D) headline height (m). Plots (C) and (D) have a lowess curve fitted to the data. See text for details of each variable. Box plots show median, quartiles, and standard range of data (1.5*(inter-quartile range).


Figure 5. Relative year effects estimated from the lognormal linear (LNL) model iterations 1 to 5 , each iteration including an extra variable.


Figure 6. Lognormal linear (LNL) model relative year effects $\pm 2 s_{A j}$.


Figure 7. Plots of residuals and observed against expected values. 7a; plot of residuals from lognormal linear (LNL) model, with LOWESS curve fitted, 7b; plot of observed versus expected values from LNL model, with $Y=Y_{i}$ line fitted, 7 c ; plot of residuals from gamma, log-link function (GLL) model, with LOWESS curve fitted, 7d; plot of observed versus expected values from GLL model, with $Y=Y_{i}$ line fitted.


Figure 8. Relative year effects estimated trom the gamma, log-link (GLL) model iterations 1 to 7, each iteration including an extra variable.


Figure 9. Gamma, log-link (GLL) model relative year effects $\pm 2 s_{A_{j}}$.


Figure 10. Comparison of relative year effects estimated from the lognormal linear (LNL) model, the gamma log-link (GLL) model, and the delta log-normal (DLN) model.


Figure 11. Sensitivity of the LNL and GLL models to removing high extremes.

