# Initial tests of the robustness of the provisional harvest control rule in Canada's Sustainable Fisheries Policy to process and measurement errors using simulated depleted fish populations 

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#### Abstract

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#### Abstract

Canada's Department of Fisheries and Oceans (DFO) Sustainable Fisheries Framework and the associated Decision Making Framework Incorporating the Precautionary Approach policies (DMF), implemented in 2009, provide a context with potential to improve fisheries management. A Provisional Harvest Control Rule (PHCR) is proposed in the DMF to allow adjustments of the annual total allowable catch based on a scientific assessment of the state of the stock. The DMF defines three spawning stock biomass Zones (Critical, Cautious and Healthy). The PHCR adjusts fishing mortality dependent on the Zone within which the spawning stock biomass is estimated to fall. Elements of the PHCR have been incorporated in the scientific advice and management approaches for a number of Canadian fish stocks. In this study, initial evaluation of the PHCR was carried out on three simulated depleted fish populations with different life histories under a variety of combinations of process error on recruitment and measurement error on spawning stock biomass. The simulations represent "bestcase" scenarios because reference points were assumed to be known exactly and the magnitude of the errors was moderate. The simulation results suggested that fish stocks in the Critical Zone should rebuild to the Healthy Zone under the PHCR with high probability (>0.78) irrespective of life history differences and the combinations of process and observations errors. However, the time to rebuild was up to twice as long as it took in the absence of fishing and the PHCR was not effective in ensuring the DMF requirement of a low probability ( $<0.1$ ) of the population returning to the Cautious Zone. The PHCR was also not effective in keeping fishing mortality below the level that generates maximum sustainable yield when the stock was in the Cautious Zone and subject to measurement error. Variation in the annual catch generated by the PHCR in the simulations increased with increasing process and observation errors to a maximum CV of 0.6 , which may be inconsistent with the fishing industry's desire for low variation in annual catch.


Keywords: Sustainable fisheries, harvest control rules, simulation evaluation, performance statistics, precautionary approach

## Introduction

In 2009, Canada's Department of Fisheries and Oceans (DFO) introduced the Sustainable Fisheries Framework Policy (SFF; DFO, 2009a) to provide a more rigorous and comprehensive approach to managing Canada's marine fisheries. A key component of this Policy is "A Fishery Decision-Making Framework Incorporating the Precautionary Approach" (DMF; DFO, 2009b) which
describes a general fishery decision-making framework for implementing a harvest strategy that complies with the Precautionary Approach (PA) as defined by the United Nations Fish Stocks Agreement (UN, 1995) and by the Food and Agriculture Organization of the United Nations (FAO; FAO, 1995). Central to the Policy's approach is the identification of desirable (target) and undesirable (limit) reference points, and specification of management objectives that avoid limits and achieve targets with regard
to spawning stock biomass (SSB) and fishing mortality $(F)$. The FAO guidelines suggest that this be achieved through decision rules that specify what management action will be taken when specified deviations from operational targets are observed. In practice, following the UN Agreement and FAO guidelines is not mandatory in Canada because the Fisheries Act allows for "ministerial discretion" in all decisions. In most cases, targets have not been defined and probability thresholds and time horizons with respect to management objectives have not been developed for Canadian fish stocks in DFO fishery management plans.

The DMF defines three zones based on stock status (typically measured in units of SSB: Healthy, Cautious and Critical Zones (Fig. 1). The Healthy Zone occurs above an Upper Stock Reference (USR). The Target Reference Point (TRP) for a stock is set within this Zone by fishery managers. Below the Healthy Zone is the Cautious Zone, bounded at low stock status by the Limit Reference Point (LRP). Below the LRP is the Critical Zone, which denotes a stock at a critically low level of $S S B$. To prevent a stock from entering the Critical Zone, a reduction in


Fig. 1. Elements of the Provisional Harvest Control Rule (PHCR) for the Canada Department of Fisheries and Oceans' (DFO) Fishery Decision Making Framework Incorporating the Precautionary Approach. The Removal Reference denotes the upper limit of fishing mortality $(F)$ in each of the three spawning stock biomass (SSB) Zones. In the Healthy Zone, $F$ must be less than or equal to the $F$ that generates maximum sustainable yield ( $F_{M S Y}$ ). $F$ must be decreased for a declining stock in the Cautious Zone to ensure a return to the Healthy Zone. In the Critical Zone, F must be kept at an absolute minimum. Under the DFO PHCR, the Upper Stock Reference Point is set at $80 \% S S B_{M S Y}$, where $S S B_{M S Y}$ is the $S S B$ consistent with fishing at $F_{M S Y}$ and the Limit Reference Point is set at $40 \% S S B_{M S Y}$. The Target Reference Point for $S S B$ is set at a level within the Healthy Zone by fishery managers.
$F$ is required when the stock is in the Cautious Zone in order to ensure it rebuilds to the Healthy Zone rather than declining further and entering the Critical Zone. If a stock is already in the Critical Zone, then it must be rebuilt, with high probability (i.e., 75-95\%), to the Cautious Zone within 1.5-2 generations. Once in the Cautious Zone, management actions are required to continue to rebuild the stock to the Healthy Zone within an additional 1.5-2 generations. Thus, the total amount of time to rebuild from the Critical Zone to the Healthy Zone could be up to 4 generations in length.

The DMF introduces a Removal Reference (Fig. 1), typically expressed in terms of $F$, which prescribes the maximum acceptable harvest rate for the stock in each of the three $S S B$ Zones. $F$ in the Healthy Zone must be less than or equal to the harvest rate associated with maximum sustainable yield ( $F_{M S Y}$ ) and in the Cautious Zone, there must be a progressive decline in $F$ with decreasing stock status. A Harvest Control Rule (HCR) determines the change in $F$. Below the LRP, the harvest rate, taking into account discards and landings, must be kept to an absolute minimum. The specific harvest rate required when the stock is below the LPR is undefined in the DMF but subsequent assessments of some stocks have shown that it can include both bycatch and directed fishing.

While the DMF recognises that stock-specific characteristics, such as life history, should be taken into consideration when developing specific HCRs for individual stocks, it also provides guidance on a Provisional Harvest Control Rule (PHCR) as an example of an HCR considered to be generally consistent with the SFF and DMF policies. In keeping with a number of management strategies applied elsewhere (Restrepo and Powers, 1999; Lassen et al., 2014; Shelton and Morgan, 2014), the PHCR is based on MSY reference points. Elements of the PHCR have been implemented for a number of Atlantic Canada fish stocks including: Units 1, 2 and 3 Redfish (McAllister and Duplisea, MS 2012; Duplisea et al., MS 2012); 3Pn4RS Atlantic Cod (Duplisea and Fréchet, MS 2009); 3NOPs4VWX+5 Atlantic Halibut (Trzcinski et al., MS 2011); 4VsW Atlantic Cod and 4X5Y Haddock (DFO, 2012); 4VW+4Xmn Pollock (Stone, MS 2012; DFO, 2011a); and 3Ps American Plaice (Morgan et al., MS 2012), as well as Pacific stocks such as Queen Charlotte Sound Pacific Ocean Perch (DFO, 2011b).

Simulation testing of fishery management strategies is widely considered to be good practice to ensure robustness to uncertainty (Deroba and Bence, 2008; 2012; Zhang et al., 2011; Wiedenmann et al., 2013; Punt et al., 2014). However, there has only been limited testing of management strategies on Canadian fish stocks (e.g. Cox
and Kronlund, 2008; Cleary et al., 2010; Shelton and Miller, MS 2009; Miller and Shelton, 2010) and no tests of the likely effectiveness of the PHCR for specific stocks, or more generally, under a range of life histories, process errors and measurement errors. Instead of simulation testing of management strategies, the DMF requires empirical evaluation of the management strategy 6-10 years after implementation. The first of such empirical evaluations has yet to take place and details regarding the approach are not available in the DMF. It is assumed such an evaluation would depend on a review of survey and catch outcomes and stock assessment reconstructions of the population, and that simulation tests of the PHCR on a stock-by-stock basis would augment this empirical evaluation.

The objective of the present study was to evaluate the general performance of the PHCR for three simulated hypothetical fish populations with different life histories and under a range of assumed process and measurement errors. Performance criteria for evaluating the PHCR were developed from the DMF's management objectives with regard to $S S B, F$ and catch. This study is considered preliminary because it was not stock-specific and did not implement a full closed-loop management strategy evaluation (MSE) that includes simulating the actual stock assessment process; widely acknowledged as the preferred approach, but one that would have to be stock-specific (Cox and Kronlund, 2008; Punt et al., 2014).

## Materials and Methods

In keeping with the MSE approach, the present study considered both the "true" simulated population and the "perceived" population; the population that would be estimated to exist from the stock assessment, taking into account measurement error (Haltuch et al., 2008). The PHCR was applied to the "perceived" population while the performance was measured with respect to the "true" population. Process error was only considered with regard to recruitment and measurement error with regard to $S S B$. The standard deviation of the errors was assumed to not exceed 0.4 , which is moderate compared to some other studies (e.g. Wetzel and Punt, 2016; Cao et al., 2014). Further, it was assumed that reference points required by the PHCR were known exactly.

## Provisional harvest control rule

The PHCR defined in the DMF adopted $80 \% S S B_{M S Y}$ as the USR and $40 \% S S B_{M S Y}$ as the LRP, where $S S B_{M S Y}$ is the spawning stock biomass corresponding to MSY. In accordance with the PHCR, the $F$ applied to the fishery was determined using the following equations:

When the stock is in the "Healthy Zone",
$F_{y}=\lambda F_{M S Y}$,
where $\lambda$ is a constant $\leq 1$.
When the stock is in the "Cautious Zone",
$F_{y}=\lambda F_{M S Y}\left(\frac{S S B_{y}-0.4 S S B_{M S Y}}{0.8 S S B_{M S Y}-0.4 S S B_{M S Y}}\right)$.
When the stock is in the "Critical Zone",
$F_{y} \approx 0$.
The simulations assumed that $\lambda=1$ and that $F_{y}=0.001$ in the Critical Zone acknowledging that, even with no directed fishing, some amount of bycatch will occur. Note that values of $F_{y}>0$ in the Critical Zone create a discontinuity in the HCR at the LRP. Changes to the PHCR to avoid this discontinuity need to be considered if directed fishing is allowed below the LRP.

## Simulated populations

Three simulated fish populations representing species with different life history characteristics (Table 1) were constructed in R (R Core Team, 2013). A similar approach was adopted by Wetzel and Punt (2016) in their simulation study of rebuilding strategies for overfished stocks in the U.S.A. and by Wiedenmann et al. (2013) in their evaluation of the performance of harvest control rules on data-poor fisheries. Here, Population A represented a slowgrowing, long-lived and late-maturing species that reached a large maximum size, Population $C$ was a fast-growing, short-lived and early-maturing species that grew to a small size, and Population B was an intermediate species in terms of growth, longevity and size. In order to ensure consistency with fish life history theory (Roff, 1992; Beverton, 1992; Sterns, 1992; Charnov, 1993; Jensen, 1996), the following approach was adopted. Maximum (terminal) age ( $A$ ) was chosen for each population and then natural mortality rate $(M)$ was computed using the empirical equation from Hewitt and Hoenig (2005) where:
$M=4.22 / A$.
Based on this value of $M$, values for the von Bertalanffy growth equation parameter, $k$, and age at $50 \%$ maturity for a logistic maturation function $\tau_{50}$, were computed for each population such that these values satisfied two life history invariant properties proposed by Jensen (1996):
$M=1.5 k$,
and

$$
\begin{equation*}
M=1.65 / \tau_{50} \tag{6}
\end{equation*}
$$

The von Bertalanffy growth equation (Quinn and Deriso, 1999) is:
$L_{a}=L_{\infty}\left(1-e^{-k\left(a-a_{0}\right)}\right)$,
where $L_{a}$ is the length at the beginning of age $a$ in centimeters $L_{\infty}$, is the asymptotic length and $a_{0}$ is the x-intercept of the curve (assumed to be zero for all three simulated populations). Values for $L_{\infty}$ were chosen in descending magnitude for Populations A, B and C, respectively.

Maturation for males and females combined was

Table 1. Life history properties of the three simulated populations created to test the performance of the Provisional Harvest Control Rule associated with the Sustainable Fisheries Framework policy of Canada's Department of Fisheries and Oceans. Population A was slow-growing and long-lived, Population B was intermediate and Population C was fast-growing and short-lived.

| Property | Explanation | Population A | Population B | Population C |
| :---: | :---: | :---: | :---: | :---: |
| $A$ (year) | Maximum age | 30 | 15 | 5 |
| von Bertalanffy growth |  |  |  |  |
| $a_{0}$ | Intercept of growth curve | 0 | 0 | 0 |
| $k$ | Growth rate | 0.094 | 0.187 | 0.563 |
| $L_{\infty}(\mathrm{cm})$ | Asymptotic length | 150 | 100 | 15 |
| Length-weight |  |  |  |  |
| $\eta$ | Constant | 0.00001 | 0.00001 | 0.00001 |
| $\omega$ | Constant | 3 | 3 | 3 |
| Maturation |  |  |  |  |
| $\tau_{50}$ (year) | Age at 50\% maturation | 11.692 | 5.870 | 1.954 |
| $v$ | Maturation rate | 0.100 | 0.300 | 0.800 |
| M | Instantaneous reat of natrual mortality | 0.141 | 0.281 | 0.844 |
| $S P R_{\mathrm{F}=0}(\mathrm{~kg}$ per age 1 fish $)$ | Spawner per recruit when fishing mortality is zero | 24.753 | 4.250 | 0.008 |
| $S P R_{\text {F=Fmsy }}$ (kg per age 1 fish $)$ | Spawner per recruit when fishing mortality gives MSY | 13.195 | 1.631 | 0.003 |
| $S P R_{\mathrm{F}=\mathrm{Fmsy}} / S P R_{\mathrm{F}=0}$ | Ratio of spawner per recruit at $F=F_{\text {MSY }}$ to spawner per recruit at $F=0$ | 0.533 | 0.384 | 0.375 |
| $h$ | Steepness parameter for Beverton-Holt stockrecruit relationship | 0.5 | 0.7 | 0.8 |
| $R P S_{\text {max }}$ (thousands of recruits/ tons of spawners) | Maximum recruits per spawner | 0.162 | 2.196 | 1895.556 |
| $r_{\text {max }}$ | Maximum instantaneous rate of population growth | 0.083 | 0.284 | 1.202 |
| $F_{\text {MSY }}$ | Fishing mortality rate that generates MSY | 0.118 | 0.458 | 1.767 |
| $F_{20 \% \text { SSBmsy }}$ | Fishing mortality rate that results in $20 \%$ of the SSB that generates MSY | 0.286 | 1.563 | 7.921 |
| $G T$ (year) | Generation time | 18.611 | 9.350 | 3.052 |
| Hoenig $M=4.22 / T_{\text {max }}$ | Hoenig's equation for caculating $M$ (Hewitt and Hoenig, 2005) | 0.141 | 0.281 | 0.844 |
| Jensen $M=1.5 * k$ | Jensen's equation for calculating $M$ (Jensen, 1996) | 0.141 | 0.281 | 0.844 |
| Jensen $M=1.65 / \tau_{50}$ | Jensen's second equation for calculating $M$ (Jensen, 1996) | 0.141 | 0.281 | 0.844 |

determined by a population-specific logistic function:
$P_{a}=1 /\left(1+e^{-v\left(a-\tau_{50}\right)}\right)$,
where $P_{a}$ is the proportion mature-at-age and $v$ is the maturation rate with respect to $\tau_{50}$.

Fish weight was obtained from length data by the following equation:
$W_{a}=\eta L_{a}^{\omega}$,
where $W_{a}$ is individual weight in kilograms at age $a$, $L_{a}$ is the length in centimeters at age $a$ and $\eta$ and $\omega$ are constants, considered to be population-invariant in this study based on the relatively small amount of variation that occurs across marine fish species (Froese, 2006).

Spawner-per-recruit in the absence of fishing, $S P R_{F=0}$, the expected average lifetime production of spawning biomass from a single age 1 recruit when $F=0$, was computed as:
$S P R_{F=0}=\sum_{a=1}^{A}\left(e^{(-M(a-1))} P_{a} W_{a}\right)$,
where $A$ is the maximum (terminal) age, i.e.. there is no plus group. The omission of a plus group was justified on the basis of the low survival ( $2-3 \%$ ) to age $A$ under $M$ for each population.
$S P R$ at $F=F_{M S Y}$ (the fully recruited fishing mortality at $M S Y$ ) was similarly calculated as:
$S P R_{F=F_{\text {MSY }}}=\sum_{a=1}^{A}\left(e^{\left(-\left(M+F_{M S Y} S_{a}\right)(a-1)\right)} P_{a} W_{a}\right)$,
where $S_{a}$ is the fishery selectivity-at-age, arbitrarily set equal to $P_{a}$.

Recruitment ( $R$, in thousands of fish) at age 1 at the beginning of year $y, N_{l, y}$, in the simulated populations was modelled using a Beverton-Holt stock-recruit function (Quinn and Deriso, 1999) with multiplicative, lognormal, autocorrelated process error $\varepsilon_{p y}$ standardized to have a mean $=1$ (Cadigan, MS 2012), such that:
$N_{1},{ }_{y+1}=\frac{\alpha S S B_{y}}{\beta+S S B_{y}} \varepsilon_{p y}$
where the spawning biomass at the beginning of year $y$ is given by
$\operatorname{SSB}_{y}=\sum_{a=1}^{A}\left(N_{a, y} P_{a} W_{a}\right)$,
and where

$$
\varepsilon_{p y}=e^{\left(\sigma_{\phi} Z_{y}-\frac{\sigma^{2}}{2}\right)},
$$

$Z_{y}=\phi Z_{y-1}+\delta_{y}$,
$\delta_{y} \sim N[0,1]$,
and
$\sigma_{\phi}=\sigma\left(1-\phi^{2}\right)^{1 / 2}$.
Here, $\sigma$ is the standard deviation of the error on a log scale, $\delta_{y}$ is an annual random normal variable with mean $=0$ and standard deviation $=1$, and $\phi$ determined the amount of autocorrelation in the error with $\phi=0$ resulting in no autocorrelation.

To obtain parameters for the Beverton-Holt model, it was re-parameterized in terms of steepness $(h)$ and virgin biomass ( $K$ ). Steepness is defined as the fraction of $R$ at $K$ when $S S B$ is reduced to $0.2 K$ (Mace and Doonan, 1988). In the re-parameterized formulation,
$\alpha=\frac{K 4 h}{S P R_{F=0}(5 h-1)}$
and
$\beta=\frac{\alpha S P R_{F=0}\left(\frac{1}{h}-1\right)}{4}$.
Steepness cannot be chosen arbitrarily because it depends on life history attributes (Mangel et al., 2010). Values of $h$ for the three simulated populations were therefore chosen to be roughly consistent with the relationship between the ratio $\frac{S P R_{F=F_{M S Y}}}{S P R_{F=0}}$ and $h$ described in Mangel et al. (2013) as well as with empirical values of $h$ estimated for real populations with life histories similar to the three simulated populations given in Myers et al. (1999).

A number of additional life history properties were calculated from those described above to further illustrate the differences between the populations (Table 1). Maximum recruits-per- spawner, $R P S_{\max }$, was estimated from the slope at the origin of the stock-recruit curve. The intrinsic rate of natural increase at low population size, $r_{\max }$, was calculated from, $R P S_{\max }, S P R_{F=0}, \tau_{50}$, and $M$ using the method described in Myers et al. (1997). Generation time $G T$ was computed as the weighted mean age where the weights were the age-specific contributions to $S P R_{F=0}$, based on Goodyear (MS 1994).

The population-updating model applied in the simulations was:
$N_{a+1, y+1}=N_{a, y} e^{-(F a, y+M)}$,
where $F_{a, y}$ was fishing mortality-at-age $a$ in year $y$, obtained by applying selectivity-at-age, $S_{a}$, to the value of $F_{y}$ generated by the PHCR based on the simulated perceived $S S B$ as described in the following section.

## Applying the PHCR to the simulated populations

The PHCR was applied to the perceived $S S B$ at the beginning of year $y, S S B_{y}^{*}$, to generate the perceived fishing mortality $F_{y}^{*}$, from which the corresponding total allowable catch (TAC), in tons, was obtained (assuming no implementation error). $S S B_{y}^{*}$ differed from the true simulated $S S B_{y}$ through the introduction of measurement error, so that
$S S B_{y}^{*}=S S B_{y} \varepsilon_{m y}$,
where $\varepsilon_{m y}$ is lognormal, autocorrelated, random measurement error obtained using the same equations described above for process error with the subscript changed from to $p$ to $m$.
$F_{y}^{*}$ was age-disaggregated by multiplying by selectivity-at-age, $S_{a}$, assumed to be constant, known and equal to $P_{a}$, so that
$F_{a, y}^{*}=S_{a} F_{y}^{*}$.
Catch, in thousands of fish at age $a$ in year $y, C_{a, y}$, was computed as
$C_{a, y}=N_{a, y}^{*}\left(1-e^{-\left(M+F_{a, i}^{*}\right)}\right) \frac{F_{a, y}^{*}}{\left(F_{a, y}^{*}+M\right)}$
$N_{a, y}^{*}$ is the perceived numbers at age $a$ at the beginning of year $y$ and was obtained by finding, through iteration, the vector of population numbers-at-age in each year that satisfied

$$
\begin{equation*}
\operatorname{SSB}_{y}^{*}=\sum_{a=1}^{A}\left(N_{a, y}^{*} P_{a} W_{a}\right), \tag{21}
\end{equation*}
$$

subject to the constraint that the proportions-at-age in the perceived population was identical to the proportions in the true simulated population, and considering $S S B$ to comprise the mature biomass of males and females combined.

The TAC given by the PHCR, and therefore the catch, in year $y$ was computed as
$T A C_{y}=\Sigma_{a=1}^{A}\left(C_{a, y} W_{a}\right)$.
Because $T A C_{y}$ was obtained from the PHCR applied to, $S S B_{y}^{*}, F_{y}$ corresponding to $T A C_{y}$ will differ from $F_{y}^{*}$ generated by the PHCR when measurement error exists.
$F_{y}$ was found iteratively by satisfying the condition that:
$T A C_{y}=\sum_{a=1}^{A}\left(N_{a, y}\left(1-e^{-\left(M+S_{a} F_{y}\right)}\right) \frac{S_{a} F_{y}}{\left(S_{a} F_{y}+M\right)} W_{a}\right)$.

## Simulation runs

The PHCR was evaluated for each population over a 50 -year time horizon. The initial state of the stock was an equilibrium population with a stable age composition consistent with $S S B$ that was $20 \%$ of the true $S S B_{M S Y}$, i.e. in the middle of the Critical Zone. For each population, two deterministic reference runs of the simulation model were carried out, the first at $F=0$ (i.e. no fishing throughout the 50 -year time period) and the second under the application of the PHCR. The PHCR was then applied under stochastic conditions for various values of standard deviation and autocorrelation in process and measurement errors. For each error combination, 1000 repeats of the simulation were completed to allow performance of the PHCR to be evaluated.

The following runs of the simulation model, totalling 24 each for Populations A, B, and C, were carried out:
(i) Two deterministic reference runs, under $F=0$ and under application of the PHCR;
(ii) Process error-only runs for $\sigma_{p}=0.2$ with $\phi_{p}=0$, $0.3,0.6$ and $0.9 ; \sigma_{p}=0.3$ with $\phi_{p}=0$ and 0.9 ; and $\sigma_{p}=0.4$ with $\phi_{p}=0$ and 0.9 ;
(iii) Measurement error-only runs with $\sigma_{m}=0.2$ with $\phi_{m}=0,0.3,0.6$ and $0.9 ; \sigma_{m}=0.3$ with $\phi_{m}$ $=0$ and 0.9 ; and $\sigma_{m}=0.4$ with $\phi_{m}=0$ and 0.9 ;
(iv) Combined process and measurement error runs with $\sigma=0.4$ and $\phi=0.9$ for both errors, $\sigma_{p}=0.4$ and $\phi_{p}=0.9$ combined with $\sigma_{m}=0.2$ and $\phi_{m}=0.9, \sigma=0.3$ and $\phi=0.9$ for both errors, $\sigma_{p}=0.3$ and $\phi_{p}=0$ combined with $\sigma_{m}=0.3$ and $\phi_{m}=0$, and $\sigma_{p}=0.4$ and $\phi_{p}=0$ combined with $\sigma_{m}=0.4$ and $\phi_{m}=0$.

## Performance statistics

Quantitative performance statistics for evaluating the PHCR were derived from the SFF and DMF documents. The following twelve statistics were defined:
(i) TRCZ is the mean time to reach the Cautious Zone across runs;
(ii) PBCC is the mean probability of $S S B$ falling in the Critical Zone in any one year, subsequent to reaching the Cautious Zone, across runs;
(iii) TRHZ is the mean time to reach the Healthy Zone across runs;
(iv) PRHZ is the mean probability of reaching the Healthy Zone within the 50 -year simulation period across runs;
(v) PBHC is the mean probability of $S S B$ falling in the Cautious Zone in any one year, subsequent to reaching the Healthy Zone, across runs;
(vi) PBHL is the mean probability of $S S B$ falling in the Critical Zone in any one year, subsequent to reaching the Healthy Zone, across runs;
(vii) PFCM is the mean probability of $F$ exceeding $F_{M S Y}$ for years when the stock is in the Cautious Zone, across runs;
(viii) PFA2 is the mean probability of $F$ exceeding $1.2 F_{M S Y}$ in any year of the 50 year simulation period across runs;
(ix) PFA5 is the mean probability of $F$ exceeding $1.5 F_{M S Y}$ in any year of the 50 -year simulation period across runs;
(x) CV10 is the mean coefficient of variation in the catch over the last 10 years across runs;
(xi) AC50 is the mean of the ratio of catch to MSY over the 50 -year simulation period across runs; and
(xii) AC 10 is the mean of the ratio of catch to MSY over the last 10 years across runs.

## Analysis of performance statistics

Performance statistics for all runs were tabulated. Process error-only and measurement error-only results were plotted to determine the effects of the standard deviation and autocorrelation in the error on performance statistics. Plots covered the range of standard deviation under zero autocorrelation and the range of autocorrelation under $\sigma=0.2$. Minimum and maximum values for each performance statistic were computed across all simulation runs in which the PHCR was applied, including the deterministic runs, to determine the range of outcomes. Analysis of variance (ANOVA) was carried out on the same data to determine overall significance of the main effects, which included Population (A, B or C) and levels
of $\sigma_{p}, \phi_{p}, \sigma_{m}$, and $\phi_{m}$. A full factorial design was not conducted because all combinations of $\sigma$ and $\phi$ for process and measurement error were not evaluated. Because of a balanced design, the order of the main effects did not matter in determining significance. Main effects were considered significant for $p<0.05$.

## Results

Performance statistics for the simulation trials in which the PHCR was applied under deterministic conditions and process error-only (Table 2) measurement error-only (Table 3) and combined process and measurement error (Table 4) showed considerable variability in some cases, dependent on life history and error combination. In other cases, performance statistics were found to be insensitive to the range of errors examined.

## Deterministic reference runs

The simulated $S S B$ values for each of the three populations, under deterministic conditions with no fishing, illustrated the impact of differences in life history (Fig. 2a, Table 2). Population A grew slowly, reaching the Healthy Zone by year 19. Population B reached the Healthy Zone by year five and Population C reached the Healthy Zone by year three. When fishing took place under the conditions of the PHCR, Population A reached the Healthy Zone by year 34, Population B by year 10, while in Population C there was no change in the time to reach the Healthy Zone (Fig. 2b, Table 2). An inflection in population growth occurred earliest and was only slight in Population A but occurred later and was more evident in Populations B and C (Fig. 2b). The inflections were caused by life historymediated, lagged impacts on $S S B$ as a result of the change in $F$ from a low value in the Critical Zone to increasing $F$ generated by the PHCR with increasing $S S B$ in the Cautious Zone. The PHCR resulted in $S S B$ eventually stabilizing at $S S B_{M S Y}$ in Population B and C, however, for Population A, the 50-year time horizon of the simulation was insufficient for this to occur. In the absence of process and measurement error, the expectation is that the PHCR will lead to recovery to the Healthy Zone for stocks that are in the Critical Zone, irrespective of life history differences. However, depending on life history, the time to rebuild to the Healthy Zone under the PHCR could take up to twice as long as it would take in the absence of fishing.

## Process error-only runs

Process error-only runs plotted against $\sigma_{p}$ (Fig. 3) and $\phi_{p}$ (Fig. 4) illustrate the impact of these two aspects of variability. Recall that process error was only applied to recruitment. There was no effect of $\sigma_{p}$ on TRCZ, PBCC,
Table 2. Performance statistics for the Canada's Department of Fisheries and Oceans' Provisional Harvest Control Rule, for three simulated populations under deterministic conditions and process error. A total of 1000 simulation runs were conducted over a 50 -year time horizon for each population (see Table 1 for details of the life history
 in Figure 1. $\sigma_{p}$ is the standard deviation of the process error, $\phi_{p}$ is the autocorrelation of the process error, $\sigma_{m}$ is the standard deviation of the measurement error $\phi_{m}$, is the autocorrelation of the measurement error. TRCZ is the time to reach the Cautious Zone, PBCC is the probability of reaching the Cautious Zone, PRHZ is the probability of reaching the Healthy Zone, TRHZ is the time to reach the Healthy Zone, PBHC is the probability of returning to the Cautious Zone having reached the Healthy Zone, PBHL is the probability of returning to the Critical Zone having reached the Healthy Zone, PFCM is the probability that fishing mortality $(F)$ will exceed the fishing mortality that generates maximum sustainable yield $\left(F_{M S Y}\right)$ for years when the stock is in the Cautious Zone, PFA2 is the probability that $F$ will exceed $1.2 F_{M S Y}$, PFA5 is the probability $F$ will exceed $1.5 F_{M S Y}, \mathrm{CV} 10$ is the mean coefficient of variation in the catch over the last 10 years, AC50 is the mean of the ratio of catch to $M S Y$ over the 50 year simulation time period and AC 10 is the mean of the ratio of catch to $M S Y$ over the last 10 years.

PBHL, PFCM, PFA2 and PFA5 (note that where only one line is visible it is because the plots for all three simulated populations were nearly identical). No impact on $F$-based performance statistics occurred because process error had no impact on the ability of the PHCR to generate the appropriate $F$ in the process error-only simulations. There was no effect of $\sigma_{p}$ on PRHZ for Populations B and C. However, for Population A, increasing $\sigma_{p}$ negatively affected PRHZ, although the decrease was small (from 1 to $<0.98$ ). The effect of $\sigma_{p}$ on TRHZ was very small, with a slight decrease with increasing $\sigma_{p}$ for Population A and slight increases for Populations B and C. The impact of $\sigma_{p}$ on PBHC was substantial with increases from 0 at
$\sigma_{p}=0$ to nearly 0.2 for Populations A and C and greater than 0.1 for Population B at $\sigma_{p}=0.4$.

Closer examination of the process error runs revealed the reason for less resilience in PBHC with increasing $\sigma_{p}$ in Populations A and C compared with B. Population A took more than 30 years, on average, to reach the Healthy Zone and the median $S S B$ remained close to the boundary between the Healthy and Cautious Zones for the subsequent 20 years. Consequently, variation in Population A caused by process error resulted in more frequent incursions into the Cautious Zone than would have been the case if median $S S B$ were higher and in


Fig. 2. Results for deterministic reference runs showing $S S B$ (expressed as a proportion of $S S B_{M S Y}$ ) for Population A (blue), B (red) and C (green) in the absence of fishing (a) and under the Provisional Harvest Control Rule (b), with initial SSB set in the middle of the Critical Zone at $20 \% S S B_{M S Y}$. The life histories of the populations are described in Table 1. The horizontal solid black line corresponds to the Limit Reference Point, the horizontal dashed line corresponds to the Upper Stock Reference Point and the horizontal dotted line corresponds to the spawning stock biomass that generates maximum sustainable yield, SSB $_{\text {MSY }}$.
Table 3. Performance statistics for the PHCR under measurement error (see Table 2 for explanations of the abbreviations).

| Pop | $\sigma_{p}$ | $\phi_{p}$ | $\sigma_{m}$ | $\phi_{m}$ | TRCZ | PBCC | PRHZ | TRHZ | PBHC | PBHL | PFCM | PFA2 | PFA5 | CV10 | AC50 | AC10 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| A | 0.0 | 0.0 | 0.2 | 0.0 | 6.149 | <0.001 | 1.000 | 30.768 | 0.068 | 0.000 | 0.198 | 0.117 | 0.018 | 0.300 | 0.510 | 0.863 |
| A | 0.0 | 0.0 | 0.2 | 0.3 | 6.121 | $<0.001$ | 1.000 | 30.394 | 0.090 | 0.000 | 0.204 | 0.115 | 0.018 | 0.284 | 0.511 | 0.863 |
| A | 0.0 | 0.0 | 0.2 | 0.6 | 6.151 | $<0.001$ | 0.996 | 30.198 | 0.105 | 0.000 | 0.204 | 0.111 | 0.015 | 0.239 | 0.511 | 0.866 |
| A | 0.0 | 0.0 | 0.2 | 0.9 | 6.236 | $<0.001$ | 0.909 | 30.920 | 0.063 | 0.000 | 0.206 | 0.098 | 0.015 | 0.142 | 0.509 | 0.860 |
| A | 0.0 | 0.0 | 0.3 | 0.0 | 6.397 | 0.003 | 1.000 | 29.643 | 0.106 | 0.000 | 0.225 | 0.171 | 0.063 | 0.459 | 0.501 | 0.850 |
| A | 0.0 | 0.0 | 0.3 | 0.9 | 6.531 | 0.006 | 0.899 | 28.878 | 0.097 | 0.000 | 0.229 | 0.146 | 0.053 | 0.238 | 0.495 | 0.847 |
| A | 0.0 | 0.0 | 0.4 | 0.0 | 6.669 | 0.008 | 1.000 | 29.399 | 0.139 | 0.000 | 0.245 | 0.201 | 0.104 | 0.614 | 0.492 | 0.835 |
| A | 0.0 | 0.0 | 0.4 | 0.9 | 6.911 | 0.017 | 0.900 | 27.628 | 0.111 | 0.000 | 0.243 | 0.172 | 0.088 | 0.334 | 0.476 | 0.830 |
| B | 0.0 | 0.0 | 0.2 | 0.0 | 3.000 | $<0.001$ | 1.000 | 9.686 | 0.029 | 0.000 | 0.228 | 0.180 | 0.038 | 0.262 | 0.851 | 0.997 |
| B | 0.0 | 0.0 | 0.2 | 0.3 | 3.001 | $<0.001$ | 1.000 | 9.727 | 0.039 | 0.000 | 0.258 | 0.177 | 0.036 | 0.235 | 0.850 | 0.997 |
| B | 0.0 | 0.0 | 0.2 | 0.6 | 3.003 | $<0.001$ | 1.000 | 9.881 | 0.057 | 0.000 | 0.293 | 0.173 | 0.036 | 0.187 | 0.849 | 0.996 |
| B | 0.0 | 0.0 | 0.2 | 0.9 | 3.008 | $<0.001$ | 0.997 | 11.624 | 0.082 | 0.000 | 0.346 | 0.172 | 0.036 | 0.096 | 0.845 | 0.990 |
| B | 0.0 | 0.0 | 0.3 | 0.0 | 3.018 | 0.001 | 1.000 | 9.139 | 0.075 | <0.001 | 0.268 | 0.240 | 0.104 | 0.420 | 0.847 | 0.999 |
| B | 0.0 | 0.0 | 0.3 | 0.9 | 3.042 | 0.003 | 0.997 | 11.249 | 0.124 | $<0.001$ | 0.397 | 0.207 | 0.083 | 0.161 | 0.831 | 0.976 |
| B | 0.0 | 0.0 | 0.4 | 0.0 | 3.051 | 0.004 | 1.000 | 8.930 | 0.112 | $<0.001$ | 0.287 | 0.263 | 0.146 | 0.568 | 0.840 | 0.992 |
| B | 0.0 | 0.0 | 0.4 | 0.9 | 3.156 | 0.009 | 0.996 | 10.790 | 0.163 | 0.002 | 0.462 | 0.239 | 0.129 | 0.231 | 0.814 | 0.958 |
| C | 0.0 | 0.0 | 0.2 | 0.0 | 2.000 | $<0.001$ | 1.000 | 3.509 | 0.090 | 0.000 | 0.285 | 0.234 | 0.085 | 0.310 | 0.958 | 0.995 |
| C | 0.0 | 0.0 | 0.2 | 0.3 | 2.000 | $<0.001$ | 1.000 | 3.571 | 0.101 | 0.000 | 0.415 | 0.232 | 0.082 | 0.259 | 0.955 | 0.993 |
| C | 0.0 | 0.0 | 0.2 | 0.6 | 2.000 | $<0.001$ | 1.000 | 3.698 | 0.114 | $<0.001$ | 0.562 | 0.228 | 0.079 | 0.196 | 0.951 | 0.989 |
| C | 0.0 | 0.0 | 0.2 | 0.9 | 2.000 | 0.001 | 1.000 | 4.476 | 0.129 | $<0.001$ | 0.608 | 0.229 | 0.078 | 0.091 | 0.946 | 0.984 |
| C | 0.0 | 0.0 | 0.3 | 0.0 | 2.000 | 0.001 | 1.000 | 3.521 | 0.157 | 0.000 | 0.279 | 0.276 | 0.156 | 0.477 | 0.955 | 0.993 |
| C | 0.0 | 0.0 | 0.3 | 0.9 | 2.000 | 0.008 | 1.000 | 4.630 | 0.196 | 0.006 | 0.669 | 0.272 | 0.143 | 0.151 | 0.929 | 0.966 |
| C | 0.0 | 0.0 | 0.4 | 0.0 | 2.003 | 0.002 | 1.000 | 3.509 | 0.194 | <0.001 | 0.264 | 0.290 | 0.194 | 0.613 | 0.949 | 0.988 |
| C | 0.0 | 0.0 | 0.4 | 0.9 | 2.019 | 0.023 | 1.000 | 4.920 | 0.220 | 0.018 | 0.650 | 0.282 | 0.179 | 0.213 | 0.907 | 0.942 |

Table 4. Performance statistics for the PHCR under combined process and measurement error (see Table 2 for explanations of the abbreviations).

| Pop | $\sigma_{p}$ | $\phi_{p}$ | $\sigma_{m}$ | $\phi_{m}$ | TRCZ | PBCC | PRHZ | TRHZ | PBHC | PBHL | PFCM | PFA2 | PFA5 | CV10 | AC50 | AC10 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| A | 0.3 | 0.9 | 0.2 | 0.9 | 6.271 | 0.002 | 0.854 | 29.803 | 0.113 | 0.000 | 0.160 | 0.084 | 0.011 | 0.200 | 0.506 | 0.868 |
| A | 0.3 | 0.0 | 0.3 | 0.0 | 6.383 | 0.002 | 1.000 | 29.691 | 0.152 | 0.000 | 0.225 | 0.169 | 0.063 | 0.470 | 0.500 | 0.845 |
| A | 0.3 | 0.9 | 0.3 | 0.9 | 6.519 | 0.009 | 0.861 | 28.993 | 0.120 | $<0.001$ | 0.199 | 0.130 | 0.045 | 0.296 | 0.488 | 0.841 |
| A | 0.4 | 0.9 | 0.2 | 0.9 | 6.168 | 0.005 | 0.809 | 28.745 | 0.133 | 0.000 | 0.141 | 0.074 | 0.011 | 0.253 | 0.491 | 0.839 |
| A | 0.4 | 0.0 | 0.4 | 0.0 | 6.648 | 0.009 | 0.995 | 28.964 | 0.193 | 0.000 | 0.240 | 0.195 | 0.103 | 0.631 | 0.492 | 0.837 |
| A | 0.4 | 0.9 | 0.4 | 0.9 | 7.175 | 0.031 | 0.835 | 28.195 | 0.126 | $<0.001$ | 0.202 | 0.151 | 0.077 | 0.449 | 0.463 | 0.805 |
| B | 0.3 | 0.9 | 0.2 | 0.9 | 3.004 | 0.001 | 0.993 | 12.930 | 0.210 | 0.002 | 0.302 | 0.141 | 0.029 | 0.181 | 0.841 | 0.982 |
| B | 0.3 | 0.0 | 0.3 | 0.0 | 3.016 | 0.002 | 1.000 | 9.218 | 0.127 | $<0.001$ | 0.279 | 0.237 | 0.102 | 0.446 | 0.842 | 0.986 |
| B | 0.3 | 0.9 | 0.3 | 0.9 | 3.042 | 0.009 | 0.989 | 12.102 | 0.207 | 0.004 | 0.372 | 0.203 | 0.088 | 0.239 | 0.830 | 0.972 |
| B | 0.4 | 0.9 | 0.2 | 0.9 | 3.000 | 0.001 | 0.986 | 13.808 | 0.238 | 0.001 | 0.249 | 0.134 | 0.027 | 0.232 | 0.842 | 0.992 |
| B | 0.4 | 0.0 | 0.4 | 0.0 | 3.058 | 0.006 | 1.000 | 9.029 | 0.168 | 0.001 | 0.281 | 0.256 | 0.143 | 0.602 | 0.835 | 0.988 |
| B | 0.4 | 0.9 | 0.4 | 0.9 | 3.171 | 0.029 | 0.990 | 11.946 | 0.243 | 0.016 | 0.368 | 0.217 | 0.115 | 0.360 | 0.804 | 0.949 |
| C | 0.3 | 0.9 | 0.2 | 0.9 | 2.000 | 0.005 | 1.000 | 5.455 | 0.246 | 0.003 | 0.452 | 0.192 | 0.063 | 0.209 | 0.934 | 0.979 |
| C | 0.3 | 0.0 | 0.3 | 0.0 | 2.000 | 0.008 | 1.000 | 3.604 | 0.205 | 0.007 | 0.279 | 0.274 | 0.155 | 0.527 | 0.951 | 0.991 |
| C | 0.3 | 0.9 | 0.3 | 0.9 | 2.000 | 0.016 | 0.999 | 5.224 | 0.259 | 0.012 | 0.506 | 0.242 | 0.129 | 0.259 | 0.933 | 0.971 |
| C | 0.4 | 0.9 | 0.2 | 0.9 | 2.000 | 0.008 | 0.999 | 5.682 | 0.296 | 0.005 | 0.369 | 0.184 | 0.061 | 0.264 | 0.944 | 0.991 |
| C | 0.4 | 0.0 | 0.4 | 0.0 | 2.005 | 0.026 | 1.000 | 3.630 | 0.245 | 0.025 | 0.280 | 0.286 | 0.194 | 0.679 | 0.942 | 0.983 |
| C | 0.4 | 0.9 | 0.4 | 0.9 | 2.016 | 0.042 | 0.999 | 5.628 | 0.278 | 0.032 | 0.488 | 0.242 | 0.153 | 0.369 | 0.907 | 0.943 |

the Healthy Zone. In the case of Population C, although median $S S B$ rapidly reached a level close to $S S B_{M S Y}$, the sensitivity to process error was greater because there were only a few age classes available to smooth out the variability. The similarity in responses by Populations A and $C$ was therefore coincidental. Population $B$ reached the Healthy Zone in about 10 years, on average, and median $S S B$ reached a level near $S S B_{M S Y}$ by year 20. The combination of high median $S S B$ and the buffering effect of multiple age classes for Population B resulted in more resilience in terms of the impact of increasing $\sigma_{p}$ on PBHC compared to the other two populations. Increasing $\sigma_{p}$ resulted in increasing CV10, reaching a level greater
than 0.2 for Population A , greater than 0.1 for Population B and greater than 0.5 for Population C , at $\sigma_{p}=0.4$. AC50 and AC 10 showed slight decreases at high $\sigma_{p}$ for all three populations.

There was little or no effect, of increasing $\phi_{p}$ on TRCZ, PBCC, PBHL, PFCM, PFA2, PFA5 and AC50 (Fig. 4). There was little effect of $\phi_{p}$ on PRHZ for Populations B and C , whereas for Population A the probability decreased from 1 at $\phi_{p}=0$ to less than 0.85 at $\phi_{p}=0.9$. TRHZ decreased slightly with increasing $\phi_{p}$ for Population A, whereas it increased slightly with increasing $\phi_{p}$ for Populations B and C. There was generally an increasing


Fig. 3. Effects of the standard deviation of the process error, $\sigma_{p}$, on performance statistics for simulation runs in which the autocorrelation of the process error $\phi_{p}=0$ and the standard deviation of the measurement error $\sigma_{m}=0$. Refer to Table 2 for explanations of the performance statistics.
trend in PBHC with increasing $\phi_{p}$ for all three populations, however at the highest level of $\phi_{p}$ there was a decrease in PBHC for Population A. The decrease in PRHZ and PBHC at the highest level of $\phi_{p}$ was caused by interaction between highly autocorrelated process error and the slow $S S B$ response to change due to the life history of Population A. This changed the shape of the uncertainty envelope in which $S S B$ replicates fell such that fewer replicates reached the Healthy Zone while those that did tended to remain in the Healthy Zone. CV10 increased for all three populations with increasing $\phi_{p}$ up to $\phi_{p}=0.6$ and then declined at $\phi_{p}=0.9$ (Populations B and C ) or levelled off (Population A). Changes in AC 10 in response to increasing $\phi_{p}$ were very slight.

## Measurement error-only runs

Performance statistics for the simulation trials in which the PHCR was applied under measurement error-only are plotted against $\sigma_{m}$ (Fig. 5) and $\phi_{m}$ (Fig. 6). Recall that measurement error was only applied to $S S B$. The effect of increasing $\sigma_{m}$ was apparent in all the performance statistics, with the exception of PRHZ and PBHL (Fig. 5). However, the effect was very small on TRCZ and AC50. PBCC increased with increasing $\sigma_{m}$ for all three populations but remained very small overall. TRHZ decreased slightly with increasing $\sigma_{m}$ for Populations A and B . PBHC increased with increasing $\sigma_{m}$ in all three populations, from 0 at $\sigma_{m}=0$ to nearly 0.2 in Population


Fig. 4. Effects of autocorrelation in the process error, $\phi_{p}$, on performance statistics for simulation runs in which the standard deviation of the process error $\sigma_{p}=0.2$ and standard deviation of the measurement error $\sigma_{m}=0$. Refer to Table 2 for explanations of the performance statistics.

C, greater than 0.1 in Population A and about 0.1 in Population B, at $\sigma_{m}=0.4$. The three $F$-based performance statistics increased with increasing $\sigma_{m}$ and were greatest for Population C, intermediate for Population B and least for Population A. The exception was for PFCM, where the effect on Population C declined at $\sigma_{m}=0.3$ and $\sigma_{m}=0.4$, ending up below the corresponding value for Population B. Probabilities reached as high as 0.3 for PFA2 and 0.2 for PFA5 in the case of Population C while values for the other populations were lower. CV10 increased with increasing $\sigma_{m}$ for all three populations and were around 0.6 . AC50 and AC 10 decreased slightly with increasing $\sigma_{m}$, particularly in the case of Population A.

An effect of $\phi_{m}$ increasing on the performance statistics was most apparent with regard to $\mathrm{PBHC}, \mathrm{PFCM}$ and CV 10 (Fig. 6). PBHC tended to increase with increasing $\phi_{m}$ for all three populations with the exception of Population A at $\phi_{m}=0.9$ where there was a decrease. There was a corresponding decrease in PRHZ in Population A at $\phi_{m}=0.9$. The reason for these decreases in Population A at the highest level of $\phi_{m}$ was similar to those observed under process error, although in this case the source of variation was due to changes in $F$ which resulted from the PHCR applied to $S S B$ observed with autocorrelated measurement error. PFCM increased with increasing $\phi_{m}$ for Populations B and C but there was no effect on Population A. CV10 decreased with increasing $\phi_{m}$ for all three populations.


Fig. 5. Effects of the standard deviation of the measurement error, $\sigma_{m}$, on performance statistics for simulation runs in which the autocorrelation of the measurement error $\phi_{m}=0$ and the standard deviation of the process error $\sigma_{p}=0$. Refer to Table 2 for explanations of the performance statistics.

## Minimum and maximum values

Minimum and maximum values for all performance statistics across all runs in which the PHCR was applied (i.e.. excluding $F=0$ runs; data in Tables 2, 3 and 4) showed that TRCZ had a range of 6.00 to 7.18 years for Population A and less than one year for Populations B and C (Table 5). The range in PBCC was less than 0.05 for all three populations. PRHZ had a minimum that was population dependent, being lowest for Population A (0.78) and highest for Population C (close to 1.0). TRHZ had a wide range, more than 6 years for Population A, about 6 years for Population B and about 3.5 years for Population C. Maximum values for PBHC were close to
0.2 for Population A, close to 0.25 for Population B and about 0.3 for Population C. PBHL had a small range and was less than 0.04 for all three populations. The range in PFCM was population-dependent and was widest for Population C with a maximum of about 0.7 and smallest for Population A with a maximum of about 0.25 . Maximum values of PFA2 and PFA5 did not vary much across populations with values of about 0.2 to 0.3 for PFA2 and about 0.1 to 0.2 for PFA5. CV10 had a wide range within each population but with a maximum value that was fairly similar across all three populations ( $0.6-0.68$ ). Maximum values for AC50 were population-dependent with a narrow range within each population. AC 10 had an even narrower range within each population.


Fig. 6. Effects of the autocorrelation in the measurement error, $\phi_{m}$, on performance statistics for simulation runs in which the standard deviation of the measurement error $\sigma_{m}=0.2$ and standard deviation of the process error $\sigma_{p}=0$. Refer to Table 2 for explanations of the performance statistics.

## Analysis of variance

ANOVA results for main effects (Table 6) showed that Population was significant for all performance statistics (Tables 3, 4 and 5) with the exception of PBCC. There was a significant effect of $\sigma_{p}$ on all performance statistics with the exception of TRCZ and PRHZ. $\phi_{p}$ had a significant effect on only five of the performance statistics: PRHZ, PBHC, CV10, AC50 and AC10. The effect of $\sigma_{m}$ on the performance statistics was significant in all cases with the exception of PRHZ. $\phi_{m}$ had a significant effect on five of the performance statistics: PBCC, PFCM, CV10, AC50 and AC10. A comparison across effects showed that the catch-based performance statistics, CV10, AC50 and AC10 were significantly affected by all five main effects. PBHC was significantly affected by four of the five effects, the effect for $\phi_{m}$ being non-significant. PFCM was also significantly affected by four of the five effects, but in this case $\phi_{p}$ was non-significant.

## Discussion

In this study, initial trials of the robustness of the PHCR were explored under a range of process errors and measurement errors for three simulated depleted populations with different life histories. Life history had a significant effect on nearly all performance statistics selected for evaluating the PHCR. Both process and observation errors, and to a lesser extent autocorrelation in these errors, had significant effects on many of the performance statistics selected. However, in several cases, the range of values obtained under different error combinations was small ( $<10 \%$ ). It should be noted that a danger in the application of ANOVA on simulation results is that any variable with a non-zero effect size can be found to be significant if enough simulations are run. Responses
for some of the performance statistics were not consistent across populations. This is attributed to life history differences and the relative impact of autocorrelated errors. For example, the decline in PBHC in the slowgrowing, long-lived simulated population, at the highest levels of $\phi_{p}$ and $\phi_{m}$, was caused by interactions between the lagged response by $S S B$ to variation determined by life history and autocorrelation in the errors, which in the case of $\phi_{m}$, was mediated through changes in $F$ by the PHCR. The performance of the PHCR would change if time lags in the application of the PHCR were considered. Typically data from $y-1$ is used in year $y$ to provide scientific advice for year $y+1$, resulting in a two-year lag between data for the terminal year and when the catch advice occurs. These lags were not considered in the present study.

The simulation results showed that the DMF objective of rebuilding stocks from the Critical Zone to the Cautious Zone, with a probability of $75 \%$ to $95 \%$ within 1.5 to 2 generations (DFO, 2009b), was easily achieved for all three populations irrespective of the errors introduced in the simulations. This result occurred because the $T A C$ in the simulations was set consistent with a very low $F$ of 0.001 when perceived $S S B$ was in the Critical Zone. However, such a low F in the Critical Zone may be unrealistic. For example, Cadigan (2015) estimated fully selected $F$ for status quo catch projections of Northern Cod, a stock well below the LRP, to be 0.124 for his base model, considerably higher than the value of $F$ assumed in the simulations run here. The simulation results suggested that fish stocks in the Critical Zone could rebuild to the Healthy Zone under the PHCR with high probability ( $>0.78$ ) irrespective of life history differences and the combinations of process and observations errors. However, the amount of time necessary to rebuild under application of the PHCR was up to twice as long

Table 5. Minimum and maximum values for performance statistics across the range of error combinations evaluated in Tables 2-4 for Populations A, B and C (Pop A, B and C). Population A was slow-growing and long-lived, Population C was fastgrowing and short-lived and Population B was intermediate (see Table 2 for explanations of abbreviations).

|  | TRCZ | PBCC | PRHZ | TRHZ | PBHC | PBHL | PFCM | PFA2 | PFA5 | CV10 | AC50 | AC10 |  |
| :--- | ---: | ---: | ---: | ---: | ---: | ---: | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| Pop A |  |  |  |  |  |  |  |  |  |  |  |  |  |
| Min | 6.000 | 0.000 | 0.775 | 27.628 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.018 | 0.463 | 0.805 |  |
| Max | 7.175 | 0.031 | 1.000 | 34.000 | 0.193 | 0.000 | 0.245 | 0.201 | 0.104 | 0.631 | 0.526 | 0.878 |  |
| Pop B |  |  |  |  |  |  |  |  |  |  |  |  |  |
| Min | 3.000 | 0.000 | 0.975 | 8.930 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.804 | 0.949 |  |
| Max | 3.171 | 0.029 | 1.000 | 14.889 | 0.243 | 0.016 | 0.462 | 0.263 | 0.146 | 0.602 | 0.855 | 1.002 |  |
| Pop C |  |  |  |  |  |  |  |  |  |  |  |  |  |
| Min | 2.000 | 0.000 | 0.996 | 3.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.907 | 0.942 |  |
| Max | 2.019 | 0.042 | 1.000 | 6.544 | 0.301 | 0.032 | 0.669 | 0.290 | 0.194 | 0.679 | 0.967 | 1.003 |  |

as it took in the absence of fishing. The DMF (DFO, 2009b) suggested that, for a stock in the Cautious Zone, management actions should rebuild the stock to the Healthy Zone in 1.5 to 2 generations. Combining the amount of time defined for rebuilding to the Cautious Zone and then to the Healthy Zone suggested that a time period of up to 4 generations would be acceptable for a stock to rebuild from the Critical Zone to the Healthy Zone, i.e.. between 12 and 74 years for the three simulated stocks considered in the present analysis. Simulation results suggested that the amount of time to rebuild under the PHCR should meet these objectives with high probability despite process and observation errors. However, these rebuilding times may be overly generous. In the United States, federally managed marine fisheries are mandated to rebuild the biomass of overfished stocks to levels that support maximum sustainable yield in as short a time as possible, typically within 10 years, except in cases where the life history characteristics of the stock, environmental conditions or management measures under an international agreement dictate otherwise (Patrick and Cope, 2014). In the simulations, the starting level for all three populations was $20 \% S S B_{M S Y}$. Lesser or greater depletion in actual stocks will impact the rebuilding time and, for severely depleted stocks, rebuilding times defined in the DMF may not be met.

Having rebuilt to the Healthy Zone, the simulations found that the PHCR was not effective in ensuring a low probability ( $<0.1$ ) of preventing the return to the Cautious Zone when recruitment was subject to process error and when the spawning stock size estimates provided to the PHCR were subject to measurement error. The probability of returning to the Cautious Zone increased with increasing standard deviation of both types of errors and, in most cases, with increasing autocorrelation in the errors. The probability was as high as 0.3 in the simulations, depending on the error combination and life history. In some replicates of the simulation at higher levels of process and observation errors and higher autocorrelation in these errors, $S S B$ fell from the Healthy Zone to the Cautious Zone and remained in the Cautious Zone for the remainder of the simulation period. Future studies should consider including an additional performance statistic to capture this response. Reducing $F$ in the Healthy Zone to less than $F_{M S Y}($ i.e.. $\lambda<1)$ could be explored as a way to reduce this probability. Probabilities for returning to the Cautious Zone were highest for Population C and lowest for Population A, suggesting that the PHCR may need to be adapted to account for life history differences, such that a smaller value of $\lambda$ is adopted for fast-growing, shortlived species. An additional option that could be explored, irrespective of life history, for reducing the probability of

Table 6. P-values for the main effects of Population (A, B or C, see Table 1 for details regarding the life history of each population), $\sigma_{p}, \phi_{p}, \sigma_{m}$, and $\phi_{m}$ in an analysis of variance applied to the performance statistics resulting from simulations carried out on three populations. The Provisional Harvest Control Rule was applied under a range of process and observation errors and auto-correlation in these errors. $\sigma_{p}$ is the standard deviation of the process error, $\phi_{p}$ is the autocorrelation of the process error, $\sigma_{m}$ is the standard deviation of the measurement error, $\phi_{m}$ is the autocorrelation of the measurement error (see Table 2 for explanations of abbreviations). Results not significant at the $p<0.05$ level are denoted by NS.

| Effect | Population | $\sigma_{p}$ | $\phi_{p}$ | $\sigma_{m}$ | $\phi_{m}$ |
| :--- | ---: | ---: | ---: | ---: | ---: |
| Performance <br> statistic |  |  |  |  |  |
| TRCZ |  |  |  |  |  |
| PBCC | $<0.0001$ | NS | NS | $<0.0001$ | NS |
| PRHZ | $<0.0001$ | $<0.0001$ | NS | $<0.0001$ | $<0.0001$ |
| TRHZ | $<0.0001$ | $<0.05$ | NS | $<0.05$ | NS |
| PBHC | $<0.0001$ | $<0.0001$ | $<0.05$ | $<0.001$ | NS |
| PBHL | $<0.01$ | $<0.05$ | NS | $<0.001$ | NS |
| PFCM | $<0.0001$ | $<0.0001$ | NS | $<0.0001$ | $<0.001$ |
| PFA2 | $<0.0001$ | $<0.0001$ | NS | $<0.0001$ | NS |
| PFA5 | $<0.0001$ | $<0.0001$ | NS | $<0.0001$ | NS |
| CV10 | $<0.05$ | $<0.0001$ | $<0.0001$ | $<0.0001$ | $<0.0001$ |
| AC50 | $<0.0001$ | $<0.0001$ | $<0.001$ | $<0.0001$ | $<0.0001$ |
| AC10 | $<0.0001$ | $<0.0001$ | $<0.05$ | $<0.0001$ | $<0.0001$ |

returning to the Cautious Zone would be to commence the decrease in $F$ with decreasing $S S B$ at $S S B_{M S Y}$ rather than at the USR $\left(80 \% S S B_{M S Y}\right)$. On the positive side, there was a very low probability $(<0.05)$ of a population returning to the Critical Zone under the PHCR once it reached the Cautious Zone.

The PHCR was not effective in keeping $F$ below $F_{M S Y}$ in the simulations when the stock was in the Cautious Zone and subject to measurement error, particularly at high levels of autocorrelation. Setting $\lambda<1$ and commencing the reduction in $F$ with decreasing $S S B$ at $S S B_{M S Y}$ rather than at the USR, as suggested above, would reduce the probability of high values of $F$ in the Cautious Zone.

Variation in the annual catch generated by the PHCR in the simulations was high at higher levels of both process error in the population and observation error associated with $\operatorname{SSB}$. This raises concerns that the behaviour of the PHCR may not be consistent with the general desire of the fishing industry to minimize annual catch variation. On the positive side, the PHCR achieved average catches that were close to the $M S Y$ level once the stock had recovered, except in the case of the slowest-growing and longest-lived population which was still in the process of recovering towards $S S B_{M S Y}$ under the PHCR at the end of the 50-year simulation period.

The results from the simulation trials suggested that, depending on the nature of the errors and the life history of the population, the PHCR with $\lambda=1$ and the inflection point below which $F$ is reduced (i.e., $80 \% S S B_{M S Y}$, may not result in the desired management outcomes of keeping $S S B$ in the Healthy Zone and avoiding high levels of $F$, particularly in the Cautious Zone. HCRs can be "tuned" to improve the trade-off in performance statistics so as to better achieve management objectives (Rademeyer et al., 2007). Adjusting $\lambda$ and the inflection point to improve performance would constitute tuning the HCR. However, tuning the HCR requires that management objectives be clearly stated in terms of targets and limits and that measurable quantitative performance statistics be derived from these objectives. Yet, in most cases, targets have not been defined and probability thresholds and time horizons with respect to management objectives have not yet been developed for Canadian fish stocks in DFO fishery management plans.

The performance statistics applied in these initial trials of the PHCR were informed by the DFO SFF and DMF policies, but remain somewhat arbitrary and may not provide the best representation of management objectives associated with the DFO PA and sustainable fisheries
policies. Under the PA, some performance statistics may represent imperative conservation outcomes that have to be achieved at the possible expense of less desirable outcomes with respect to fishery-related performance statistics (Miller and Shelton, 2010). An example of an imperative outcome, consistent with the PA, would be a specific probability threshold that must not being exceeded over some specified time horizon with respect to $\operatorname{SSB}$ falling into the Critical Zone.

The coupling of HCR decision points with biological reference points (USR and LRP) is not a requirement under the DFO SFF and DMF, and an HCR that uses different $S S B$ decision points (e.g. Cox et al., 2013), or doesn't use $S S B$ decision points at all (e.g. a simple HCR based on relative change in the annual research survey index; Miller and Shelton, 2010), might result in a better trade-off in performance statistics than the PHCR. This could be explored through further simulation studies in which the performance of alternative HCRs is evaluated.

In this study, it was assumed that $M S Y$ reference points were known exactly. In practice, they need to be estimated as part of the stock assessment process. This is done either in the initial fitting of the assessment model, or as an additional model fitting exercise applied to estimates of $S S B$ and $R$ obtained from the assessment model. Traditionally, groundfish stock assessments by DFO in Atlantic Canada have been based on Virtual Population Analysis (VPA; Pope, 1972; Quinn and Deriso, 1999) and reference points have been estimated from the fitting of a stock-recruit model to the VPA estimates of $S S B$ and recruitment (e.g. Duplisea and Fréchet, MS 2009). This typically results in the "errors-in-variables" problem (Walters and Ludwig, 1981; Ludwig and Walters, 1981; Hilborn and Walters, 1992; and Quinn and Deriso, 1999), which arises because the estimation method does not account for errors in the independent variable, $S S B$. The consequence of the "errors in variables problem" is that $F_{M S Y}$ is typically over-estimated and $S S B_{M S Y}$ is typically under-estimated (Hilborn and Walters, 1992). Process error associated with recruitment can also add bias to the estimates of MSY reference points as a consequence of correlation between the residuals around the stock-recruit curve and subsequent $S S B$ (Walters, 1985). These two sources of bias could negatively impact the performance of the PHCR if they are not taken into account. Statespace models that explicitly account for both process and measurement errors in the estimation of the population may be capable of providing estimates of $M S Y$ reference points that are less biased (Walters and Martell, 2004), however the development of such models for fish stocks in Atlantic Canada is at an early stage (e.g. Cadigan, 2015).

The current analysis provides an initial evaluation of the DFO PHCR and suggests some potential weaknesses and changes that could be considered to improve performance. This study represents a "best-case" scenario, and therefore, a minimum test of the robustness of the PHCR with respect to achieving management objectives derived from the DMF. Bias in the stock assessment estimates or non-stationarity in biological or fishery parameters will negatively impact the performance of the PHCR. The level of fishing mortality, whether directed or bycatch, applied when a stock is in the Critical Zone is another important area to explore in future research. The PHCR assumes this is negligible, but this may not be realistic (e.g. Cadigan, 2015). The simulation results presented here indicate that rather than simply adopting the PHCR for all stocks, stock-specific HCRs should be developed and tuned to improve performance. However, tuning would require more explicit derivation of quantitative performance statistics to reflect management objectives with respect to both limits and targets, consistent with the DFO SFF and DMF policies.

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