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# Assessment of Scotian Shelf Snow Crab (Chionoecetes opilio) in 2017

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# **Foreword**

This series documents the scientific basis for the evaluation of aquatic resources and ecosystems in Canada. As such, it addresses the issues of the day in the time frames required and the documents it contains are not intended as definitive statements on the subjects addressed but rather as progress reports on ongoing investigations.

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# **GLOSSARY**

**Acoustic Tag** – a device bonded to the carapace of Snow Crab to allow for tracking of animal movement through the use of acoustic receivers. These tags emit a unique acoustic signature. This tagging methodology does not require the recapture of the animal for movement studies.

**Agonistic** – Behavioral term relating to aggression, appeasement and avoidance behavior that occurs between members of the same species. Agonistic behavior is a much broader term than "aggression," which simply refers to behavior patterns that serve to intimidate or damage another.

**Anthropogenic** – Resulting from the influence of human beings on nature.

**Benthic** – Occurring on the ocean floor.

**Biological Reference Points** – In the context of the Precautionary Approach, agreed-upon levels of an indicator that are considered bounds to a "healthy" or "unhealthy" population or stock.

**Biomass** – The abundance of living organisms measured in terms of its weight, mass, volume or caloric energy.

**Bitter Crab Disease (BCD)** – A fatal disease found in numerous crustacean species worldwide caused by the *Hematodinium* dinoflagellate, a parasite which inhabits the host organism's blood.

**Brachyura (Infraorder)** – Known as "true crabs" of which the Snow Crab is a member. Brachyurans are characterized by a body that is short, wide, and flat. The abdomen is reduced from a strong swimming muscle (e.g., shrimp) to a simple flap covering reproductive appendages and carry eggs. The uropods, which along with the telson form the tail fan in other decapods, are totally absent. All five pairs of walking legs are generally large with the first pair being chelipeds. The antennae and antennules are greatly reduced and originate before the eye stalks.

**Carapace Condition (CC)** – The condition of the shell of a Snow Crab. Generally related to the age of the organism and the time since last molt. See Table 5 for more details.

- **CC1** Newly molted crab. The top of carapace is light brown and shiny without surface growth of moss or barnacles. Shell is soft and claw is easily broken.
- **CC2** The top of carapace is light brown and less shiny with little to no surface growth of moss or barnacles. Shell is clean but hard.
- CC3 The top of carapace is light brown and not shiny. Some growth of moss or barnacles.
   Shell is hard.
- **CC4** The top of carapace is brown and not shiny. Usually some surface growth of moss or barnacles. Shell is hard with small scars. Underneath is yellow brown.
- **CC5** Old crab. Carapace is dark brown with substantially mossy ("dirty") surface. Decalcification (black spots) noticeable often at joints. Shell may be soft.

**Carapace Width (CW)** – The distance across the carapace of a Snow Crab (millimetres).

**Carrying Capacity (K)** – The maximum population size of the species that the environment can sustain indefinitely.

**Chela** – Pincer-like claw of a crustacean or arachnid.

**Crab Fishing Area (CFA)** – Refers to an individual management area. On the Scotian Shelf they are from north to south: 20 to 24 and 4X.

Commercial Biomass - see Fishable biomass.

**Catch Per Unit Effort (CPUE)** – The amount caught by a single fishing event, such as the weight or number of crab captured by a single trap haul.

**Density** – The amount (biomass or number) of crab per unit area.

**Distribution (Spatial)** – The geographic area in which an organism exists.

**Durometer** – A calibrated instrument used to measure the hardness of an object (such as a crab shell), scaled from 0 (soft) to 100 (hard). A durometer reading of ≥68 has been historically used to determine a hard shelled crab.

**Dynamic** – Characterized by continuous change or time. Not fixed.

**Ecosystem** – The whole of a system with all the interactions between parts, living and non-living.

**ENS** – Eastern Nova Scotia (essentially Northwest Atlantic Fisheries Organization (NAFO) statistical divisions 4VW).

**Exploitation Rate (ER)** – The ratio of biomass fished relative to their fishable biomass, where ER(t) = Landings(t) / (Landings(t) + Fishable biomass(t)).

**Extrapolate** – To infer or estimate by extending or projecting known information.

**Fishable Biomass (FB)** – The biomass of Snow Crab exploited by the commercial fishery: male, mature,  $\geq$  95 mm CW and hard shell condition (CC2 to CC5). Note that CC2 Snow Crab do not have optimal meat yields at the time of the fishery. While immature crab  $\geq$ 95 mm CW is part of the biomass that can be legally fished, this component is voluntarily returned to allow greater growth.

**Fishing Mortality (instantaneous)** – The exponential rate of death of organisms.

Fishing Mortality (relative) – See Exploitation Rate.

**Generalized Additive Model (GAM)** - A statistical method used to model and predict values of a variable of interest (e.g., biomass) as a function of non-parametric functions of dependent variables (e.g., temperature, depth, substrate grain-size, etc.).

**Harvest Control Rules** – A predetermined method for linking biological reference points and exploitation-based reference points under the Precautionary Approach to management actions.

**Individual Boat Quota (IBQ)** – The amount of Snow Crab allowed to be legally removed by an individual fisher in a given area over a given period of time.

**Individual Transferable Quota (ITQ)** – The amount of Snow Crab allowed to be legally removed by an individual fisher in a given area over a given period of time. This quota allowance be transferred to another fisher to catch.

**Instar** – A stage of an organism between molts (i.e., the hard-shelled phase).

**Interpolation** – The method of determining unknown values through the use of surrounding known values.

**Kriging** – A method of interpolation for obtaining statistically unbiased estimates of intrinsic variables (i.e., Snow Crab biomass density) from a set of neighbouring points with known values, constrained by the relative change in variability of the data as a function of distance.

**Larvae** – The early, immature form of any animal before the assumption of the mature shape.

**Metabolic Costs** – The amount of energy dispensed by an organism in the process of living (e.g., heat, organic compounds, faeces, urea/uric acid, etc.).

**Metabolic Gains** – The amount of energy gained through the intake of food or other energy sources.

**Morphometric Maturity** – Maturity status determined from measurements of body shape and size. Male Snow Crab claw height increases very rapidly in the adult stage (terminal molt), whereas females' abdominal width increases with maturity. While morphometric maturity generally coincides with physiological maturity, morphometrically immature males are known to be able to fertilize females.

**Molt** – The act of growing, through the shedding of an organism's current shell.

**Multiparous** – Females bearing eggs resulting from their second or third breeding event (mating).

**Numerical Density** – The number of Snow Crab in a given surface area.

**Pelagic** – Occurring in the water column (not on bottom).

**Pencil-clawed Crab** – Immature crab that are legally exploitable (≥95 mm CW) but not yet terminally molted. The final growth increment is estimated to increase the body weight by approximately 250%.

**Physiological Maturity** – Biologically (functionally) able to reproduce (even though a crab may not be terminally molted).

**Precautionary Approach (PA)** – In the context of resource management, management approaches that seeks to not risk the long-term sustainability of a resource, as well as its ecosystem.

**Primiparous** – Females bearing eggs resulting from their first breeding event (mating).

**Recruitment** – Snow Crab that are expected to enter the fishable biomass in the next fishing season, designates as "R-1".

**Sexual Dimorphism** – When shape and/or size differences exists between sexes of a species.

**Soft-shell** – Carapace condition in which the shell produces a durometer reading of less than 68 durometer units.

**Spatial** – Relating to space (such as a given geographic region such as the Scotian Shelf).

**Spaghetti Tag** – a traditional marked-recapture tag which is place around the carapace of a Snow Crab between its walking legs. Consists of a polymer band, a disk containing unique identification and a crimp to attach tag. Requires recapture of the tagged animal and subsequent reporting to be used in movement studies.

**Spawning Stock Biomass (SSB)** - The biomass of the members of a stock able to contribute to the future propagation of the stock, generally considered as the biomass of mature females.

**Substrate** – Bottom type on which an animal exists (rocks, boulders, mud, sand, etc.).

**Total Allowable Catch (TAC)** – The amount of Snow Crab allowed to be legally removed in a given area over a given period of time.

**Temporal** – Relating to time (such as a given period of time).

**Terminal Molt** – Snow Crab molted for a final time once mature. The size of these crab will not increase further.

**White Crab** – Refers to recently molted crab mostly of carapace conditions (CC) 1 and 2. These are not commercially desirable crab due to low meat yield.

# **ABSTRACT**

Landings of Snow Crab (Chionoecetes opilio) in 2017 for North-Eastern Nova Scotia (N-ENS) and South-Eastern Nova Scotia (S-ENS) were 813 t and 6.719 t, respectively, and they were 80 t in 4X for the 2016/2017 season, representing an increase of 280% (N-ENS) and decreases of 30% (S-ENS) and 47% (4X) relative to the previous year. Total Allowable Catches (TACs) in 2017 were 825 t, 6,730 t and 80 t in N-ENS, S-ENS and 4X, respectively. Non-standardized catch rates in 2017 were 90 kg/trap haul in N-ENS, 94 kg/trap haul in S-ENS, and 25 kg/trap haul in 4X in 2016/2017, which, relative to the previous year, represents decreases of 18%,11% and 19%, respectively. The capture of soft-shelled crab in N-ENS increased to 5% from approximately 1% in 2016. In S-ENS, the relative occurrence of soft-shell crab was 1.5% for the 2017 season. Soft-shell discard rates in 4X remain very low, due to it being a fall and winter fishery. Soft-shell incidence and associated potential handling mortality is forever an issue requiring diligent and adaptive management action. Bycatch of non-target species is extremely low (<0.1%) in N-ENS and S-ENS. Crab Fishing Area (CFA) 4X bycatch levels decreased to <1%, likely due to a constriction of fishery footprint. In both N-ENS and S-ENS, moderate internal recruitment to the fishery is expected for the next year and beyond, based on sizefrequency histograms. Crab Fishing Area 4X shows little potential for substantial internal recruitment to the fishery for the next four to five years. Movement will likely be an important source of 4X crab for the next several years. The low abundance of both the mature and immature crab in the adjacent portion of CFA 24 and strong constriction of ideal Snow Crab habitat fields in 4X create future uncertainties. The mature component of female Snow Crab in all areas increased in 2017, due to large scale maturation of a pulse of immature female crab. These population characteristics are tempered by a number of uncertainties, including the influence of predation and rapid temperature swings (especially in CFA 4X and parts of CFA 24). Both can have direct and indirect influences upon Snow Crab, which are cold-water stenotherms. The introduction of the Ibm biomass modelling approach for 2016 provided somewhat erratic inter-annual abundance estimates. The current stmv approach has simplified the model inputs and added local temporal smoothing of abundance estimates to provide more reasonable estimates of fishable biomass. The post-fishery modelled fishable biomass of Snow Crab in N-ENS was estimated to be 3,140 t (2,794 in 2016). In S-ENS, the post-fishery modelled fishable biomass index was 37,640 t (40,100 t in 2016). In 4X, the pre-fishery fishable biomass was 120 t (relative to 149 t in 2016/2017). The N-ENS fishing mortality (F) in 2017 has been estimated to have been 0.18 (exploitation rate 0.16), a decrease from 0.33 in 2016. Fishable biomass increased in 2017 and though in the "Healthy" zone, remains low. Recruitment has been low for a number of years but has begun increasing and has the potential to continue for the next 2-5 years, contingent on survival of recruiting size classes. In N-ENS, a moderate decrease in TAC is recommended. The S-ENS fishing mortality (F) in 2017 has been estimated to have been 0.25 (exploitation rate 0.22), a moderate increase from 0.23 in 2016. Good recruitment and a relatively stable size structure suggest a positive outlook. Though the stock is in the "Healthy" zone, modelled biomass estimates are low. In S-ENS, a moderate decrease in TAC is recommended. Fishing mortality in 4X for 2016/2017 was estimated to be 0.36 (0.22 in 2015/2016). Increasing temperature and associated constriction of available viable Snow Crab habitat threatens the existence of the 4X Snow Crab stock. In 4X, the modeled fishable biomass remains low and the stock is currently estimated to be in the "Critical" zone.

#### MANAGEMENT

The Scotian Shelf Ecosystem (SSE) Snow Crab (*Chionoecetes opilio*) stock is managed as three main areas: North-Eastern Nova Scotia (N-ENS), South-Eastern Nova Scotia (S-ENS) and 4X (Table 1; Figure 1). South-Eastern Nova Scotia (S-ENS) is subdivided into two fishery management areas: Crab Fishing Area (CFA) 23 and CFA 24. These areas are *ad hoc* divisions based upon political, social, economic and historical convenience, with little biological basis.

Fishing seasons have also had a complex evolution based upon economic, safety and conservation considerations: seasonal weather conditions; catch of soft-shell / white crab; disruption of mating periods; and overlap with other fisheries, especially lobster and northern shrimp. From 1982 to 1993, the management of the Eastern Nova Scotia (ENS) fisheries was based on effort controls (size, sex, shell-hardness, season, license, trap limits). Additional management measures were introduced from 1994 to 1999: Individual Boat Quotas (IBQs), Total Allowable Catches (TACs), 100% dockside monitoring, mandatory logbooks and at-sea monitoring by certified observers (currently at levels of 5%, 5%, and 10% in N-ENS, S-ENS, and 4X, respectively). Vessel Monitoring Systems (VMS) have been implemented in S-ENS and 4X, and voluntary management measures requested by fishers were also introduced in some areas, such as a shortened fishing season and reduced numbers of traps. The designation of a "temporary license" holder was dropped in 2005 with a fleet rationalization that created a permanent stake in the fishery for all license holders.

In 2006, the soft-shell protocol was modified in S-ENS due to the expectation of an increased incidence of soft-shelled Snow Crab and the potential harm associated with handling mortality. Soft-shelled crab incidence observed by at-sea-observers was relayed to Fisheries and Oceans Canada (DFO) within 24 hours of landing, plotted on a two-minute grid and re-broadcast to all members of industry on the ENS Snow Crab web location (as well as via email and fax).

Fishers are asked to voluntarily avoid fishing within 1.5 nautical miles of the locations that had greater than 20% soft crab in the observed catch. This adaptive fishing protocol allows rapid adjustment of fishing effort, shifting gear away from, or altogether avoiding, potentially problematic areas and also helping to save time, fuel and other costs. This approach was not required in 4X due to the low incidence of soft crab in the catch and not adopted in N-ENS due to the very short season. However, due to high soft-shell incidence in N-ENS in 2007/2008, direct management measures were implemented to address concerns of soft-shell handling mortality. These measures now include a spring season, in addition to the traditional summer season. This spring season was so instrumental in drastically reducing soft-shell catches that season start times were moved earlier in S-ENS as well. Finally, the voluntary return to the sea of immature, legal sized crab (> 95 mm carapace width (CW); "pencil-clawed" crab) was implemented in 2006 for all areas on the SSE, to allow these crab to complete their molting cycle and molt to maturity, thereby simultaneously increasing the total yield per crab captured, as well as the total lifetime reproductive success of these large-sized males.

In 1996, DFO (Gulf Fisheries Centre (GFC), Moncton, New Brunswick) and SSE Snow Crab fishers initiated a Joint Project Agreement to assess SSE Snow Crab using a fisheries-independent trawl survey (Biron et al. 1997). It was officially accepted for use as an assessment tool in 1999. These surveys demonstrated the presence of unexploited crab in the south-eastern areas of the SSE, which subsequently led to large increases in TACs (Tables 2-4), fishing effort, landings and catch rates (Figures 2-4) and the addition of new participants. Trawl surveys were formally extended to 4X in 2004.

Since 2013, research has been funded through Section 10 of the *Fisheries Act* ("fish allocation for financing purposes"). This mechanism provides additional quota to any license holder

participating in a "Collaborative Agreement" (CA), which directly funds the Snow Crab scientific research program in the Maritimes Region. Since its inception in 2013, all license holders in the region have participated in the CA.

A Marine Stewardship Council (MSC) Certification was granted to the ENS fishery in September 2011. Four surveillance audits have been completed since that time. The Scotian Shelf Snow Crab fishery was re-certified under MSC Version 2 in September of 2017, without conditions. The fundamental difference between the prior standard and Version 2 is that the habitat and ecosystem considerations are much broader, taking into account cumulative impact of all certified fisheries in the fishing area being assessed. Though no audits were expected to occur until late summer of 2018, an expedited audit was convened in November 2017 due to numerous interactions between Snow Crab fishing and endangered North Atlantic Right Whales (NARW) in the neighboring Snow Crab regions in the southern Gulf of St. Lawrence. Audit results maintained MSC certification for Scotian Shelf Snow Crab. Through a separate process, MSC certification was suspended for the Gulf of St. Lawrence Snow Crab fishery due to negative interactions with NARW.

# **HISTORY**

The Snow Crab fishery is currently the third most valuable <u>commercial fishery</u> in Atlantic Canada and fourth in Nova Scotia. It has been active since the mid-1970s (Figure 2). The earliest records of landings were at levels of less than 1,000 t, mostly in the near-shore areas of ENS. By 1979, landings rose to 1,500 t, subsequent to which the fishery declined substantially in the mid-1980s and was considered a collapsed fishery. Recruitment to the fishery was observed in 1986 and, since that time, landings, effort and catch rates have increased considerably (Figures 2-4). In 1994, directed fishing for Snow Crab began in 4X, the southernmost range of distribution, and continues at low harvest levels.

Annual TACs (Tables 2-4) increased to a peak in 2002/2003 at 9,113 t in S-ENS and 1,493 t in N-ENS. Approximately 10,000 t of Snow Crab were landed each year from 2000 to 2004. Thus, in S-ENS the post-1998 period was one of rapid expansion of both the economic importance of the crab fishery and also the spatial extent of the exploitation. In 2004, with persistent low levels of recruitment and a steady decline in fishable biomass estimates since the early-2000s, precautionary exploitation strategies were adopted throughout the SSE.

In N-ENS, due to negligible recruitment, TACs declined sharply from 2004-2008. Increasing recruitment and fishable biomass estimates saw increased TACs until 2014. In 2015 and 2016, TACs were reduced due to low commercial biomass and an almost complete lack of recruitment to the fishery. These declines were exacerbated by the adoption of harvest control rules forcing the exploitation strategy in N-ENS to be more conservative. A new biomass estimation model ("LBM", details in Methods section) was adopted in the 2017 assessment (2016 survey). This novel modelling approach saw a substantial increase in the biomass estimates for N-ENS. In 2017, the TAC for N-ENS was the highest since 2004, in spite of continued poor recruitment to the fishery.

In S-ENS, TACs rose from 2005 to reach a previously unseen level in 2010, then gradually declined until 2015. A 15% reduction occurred in 2016 followed by an additional 30% decrease in 2017 due to decreased biomass estimates.

The TACs in 4X varied between 230 t and 346 t from 2005 to 2012. Reduced biomass estimates and poor performance of the 2012/2013 fishery in 4X (<1/2 TAC landed) resulted in drastic reductions in the 4X TAC for 2013/2014. The 4X TAC has remained low (relative to pre-2013 levels), as have commercial biomass estimates.

#### **METHODS**

The primary driver of the analytical approaches developed for the assessment of Snow Crab on the SSE is the high temporal and spatial variability in spatial distributions of Snow Crab. This is likely due to the area being the southern-most extreme of the species' distributional range in the northwest Atlantic. All data analyses were implemented in the statistical computing language and environment R (R Development Core Team 2012) to allow migration and documentation of methods into the future. The complete analytical suite, coded in R, is posted to a <a href="GitHub">GitHub</a> repository website.

Conversions between cartographic and Cartesian co-ordinate systems for analytical purposes were computed with PROJ (Evenden 1995, Version 4.4.9) via the R-package rgdal (Bivand et al. 2016) onto the Universal Transverse Mercator grid system (UTM Region 20).

A number of spatial and/or temporal interpolation methods were used in this assessment. For rapid visualization of data (but not the actual assessment), thin-plate-splines were computed with the R-package fields::fastTps (Nychka et al. 2015), using a Wendland compactly supported covariance function with a range parameter of 25 km radius (theta) from every datum. This is a range comparable with that observed in the empirical variograms of many variables (Choi and Zisserson 2012). For analytical purposes, a novel lattice-based approach has been used (see below) since 2017.

### **FISHERIES DATA**

Fishery catch rates are potentially biased indicators of crab abundance. The spatial and temporal distribution of both crabs and the fishing effort are not uniform, varying strongly with season, bottom temperatures, food availability, timing of spring plankton blooms, reproductive behavior, substrate/shelter availability, relative occurrence of soft and immature crab, species composition, fisher experience, bait type and soak time and ambient currents. Catch rates have not been adjusted for these influences and are presented here only to maintain continuity with historical records. Fishery catch rates are used as a measure of fishery performance and not stock performance / abundance.

Mandatory commercial fishing logbooks (completed onboard fishing vessels by the captain) provide information on location, effort (number of trap hauls) and landings (verified by dockside monitoring). The data are stored in the MARFIS database (DFO Maritimes Region, Policy and Economics Branch, Commercial Data Division). Data were quality checked.

At-sea-observed data provides information about the size structure and the Carapace Condition (CC) of the commercially exploited stock (Table 5; Figure 5). The data are stored in the Observer Database System (ISDB). At-sea-observers are deployed randomly with the coverage being as evenly distributed as possible between vessels. The target coverage (as a percent of total landings observed) was 5% in S-ENS and N-ENS and 10% for 4X. This information was also used to compute the potential bycatch of non-Snow Crab species by the Snow Crab fishery. Bycatch estimates of each species *i*, was extrapolated from the biomass of species *i*, observed in the catch and the relative observer coverage by:

Bycatch; [kg] = Observed catch; [kg] × Total Snow Crab landings [kg] / Observed catchsnow Crab [kg]

### RESEARCH SURVEY DATA

Spatial coverage in the survey is (1) extensive, going well beyond all known commercial fishing grounds and (2) intensive, with a minimum of one survey station located pseudo-randomly in every 10 x 10 minute area (Figure 6). This sampling design was initially developed to facilitate geostatistical estimation techniques (Cressie 1993). Additional stations have been added

adaptively based upon attempts to reduce local estimates of prediction variance, as well as identifying the spatial bounds of Snow Crab habitat. Between 2004 and 2017, approximately 400 stations have been sampled annually. The survey vessel *F/V The Gentle Lady* was used from 2004-2013. Due to the sinking of *F/V The Gentle Lady* in December 2013 during a commercial fishing trip, the subsequent surveys have been conducted aboard a vessel with similar characteristics; the *F/V Ms. Jessie*. To maintain a consistent time series, the same captain, net and net monitoring systems have been used since 2004. Due to adverse weather conditions throughout the survey season of 2017, 32 stations did not get sampled as planned. These stations were on southern side of Banquereau Bank, on the south-east corner of the Scotian Shelf continental edge.

The extensiveness of the sampling design allows the objective determination of the spatial bounds of the Snow Crab population; information that must be known if reliable estimates of biomass and population structure (e.g., size, sex, maturity) are to be made. The spatial distribution of Snow Crab is quite dynamic and so can rapidly shift to areas where they are not "traditionally" found. In addition, the distribution patterns of immature, soft-shelled, very old and female crabs do not correspond completely to those of legal size males. The former are considered to be less competitive and more susceptible to predation (Hooper 1986) and usually observed in environments or substrates with greater cover (gravel, rocks; Comeau et al. 1998). Sampling that focused upon only those areas where large hard-shelled males occur in high frequency would preclude the reliable estimation of the relative abundance of these other important segments of the crab population.

Due to the gradual evolution of the aerial extent and alterations in the intensity and timing of surveys since the mid-1990s, direct inter-annual comparisons of the data are made difficult over the entire time series. As a consequence, temporal trends are most reliable for the post-2004 period. In all areas, fishing grounds are left fallow for as long as possible from timing of commercial fishing to the surveying of that particular area. This allows for crab populations to redistribute as naturally as possible following localized removals (i.e., commercial catches). Late fishing efforts, resulting from possible fishing season extensions, can impact this natural redistribution of crab.

A custom *Bigouden Nephrops* trawl, a net originally designed to dig into soft sediments for the capture of a lobster species in Europe, was used to sample the Snow Crab and other benthic fauna (headline of 20 m, 27.3 m foot rope mounted with a 3.2 m long, 8 mm chain, with a mesh size of 80 mm in the wings and 60 mm in the belly and 40 mm in the cod-end). Net configuration was recorded with wireless trawl monitoring sensors; depth and temperature were recorded with Seabird SBE 39 temperature and depth recorders; and positional information was recorded with a global positioning system. Actual duration of bottom contact was assessed from trawl monitoring and Seabird data streams. The ship speed was maintained at approximately two knots. The warp length was approximately three times the depth. Swept area of the net was computed from swept distance and monitored net width. Detailed descriptions of sampling protocols can be found in Zisserson (2015).

All crab were enumerated; measured with calipers; shell condition determined (Table 5); claw hardness measured with a durometer; and weighed with motion-compensated scales. Captured crabs were also visually examined for the occurrence of Bitter Crab Disease (BCD). Data entry and quality control was provided by Javitech Ltd. and migrated onto the Observer Database System, held at DFO, BIO (Bedford Institute of Oceanography, Dartmouth, Nova Scotia).

In cases where individual Snow Crab animals cannot be weighed (missing legs, excessive barnacle growth, etc.), individual weight estimates were approximated from CW measurements

by applying an allometric relationship developed for SSE adult hard shelled Snow Crab (Biron et al. 1999; R2=0.98, n=750):

mass 
$$[g] = 1.543 \times 10^{-4} \times CW [mm]^{3.206}$$

The maturity status of males was determined from a combination of biological staging through CC and morphometric analysis. While physiological maturity is not directly coincident with the onset of morphometric maturity (Sainte-Marie 1993), the latter is more readily determined and is considered a reasonable proxy for physiological (sexual) maturity.

In the terminal molt of male Snow Crab, a disproportionate increase of Chela Height (CH) relative to CW is generally observed. Morphometrically mature males (M(male)) can be discriminated from morphometrically immature males via the following equation (E. Wade, personal communication, GFC):

$$M_{(male)} = -25.324 \cdot ln (CW [mm]) + 19.776 \cdot ln (CH [mm]) + 56.650$$

where an individual is considered mature if  $M_{(male)} > 0$ .

The maturity status of females is assessed from direct visual inspection of egg presence. Where maturity status was ambiguous, maturity was determined morphometrically, as the width of abdomen (measured by the width of the fifth abdominal segment, AW) increases rapidly relative to CW at the onset of morphometric maturity, facilitating the brooding of eggs. This onset of morphometric maturity ( $M_{\text{(female)}}$ ) can be delineated via the following equation (E. Wade, personal communication, GFC):

$$M_{\text{(female)}} = -16.423 \cdot \text{In (CW [mm])} + 14.756 \cdot \text{In (AW [mm])} + 14.900$$

where an individual is considered mature if  $M_{\text{(female)}} > 0$ .

Sex ratios (proportion female by number) were calculated as:

Sex ratio = 
$$N_{(female)} / (N_{(male)} + N_{(female)})$$

The BCD infections of Snow Crab were first detected on the trawl survey in 2008. From 2009-2011, laboratory analysis of haemolymph occurred to monitor actual infection rates within the Scotian Shelf Snow Crab population. This method was suggested to improve the detection rates as visual assessments are only effective in identifying late-stage infections. Upon critical comparison of the visual and laboratory results of BCD detection, visual assessment was determined to be a more robust method of detection. As such, the laboratory testing of crab haemolymph was discontinued due to high costs and unreliable results.

Size-frequency histograms were expressed as number per unit area swept in each size interval (No. km<sup>-2</sup>; i.e., the arithmetic mean numerical density per unit area). Modes and the bounds of each modal group were identified from size frequency distributions. Through development, Snow Crab molt through several instar stages. Each instar (I) was determined after an analysis of size-frequency distributions to have a lower bound of CW (mm) approximated by (see also Figure 7):

$$CW_{(I, male)}$$
 [mm] =  $\exp(1.918 + 0.299 \cdot (I - 3))$   
 $CW_{(I, female)}$  [mm] =  $\exp(2.199 + 0.315 \cdot (I - 4))$ 

# SPACE-TIME MODELING

For assessment of Snow Crab fishable biomass, an R-package (<u>stmv</u>) was developed to assimilate, model and interpolate space-time processes. An in-depth description of the **stmv** (Spatiotemporal models of variability) approach can be found in Appendix 1. The **stmv** approaches a given smooth space-time process such as Snow Crab biomass as an

hierarchical, two-stage process that is conceptually similar to kriging with "external drift" (Cressie 1993) or more formally known as "Model-based Geostatistics" (Diggle et al. 2003), where the influence of environmental and biological factors are modeled globally as a first pass ("external drift") and then the residual spatial (and in our case, spatio-temporal) patterns are modeled separately at a second stage. Generally, a simple spatial covariance (variogram) is assumed or estimated for the whole space-time domain and forms the basis of kriging with external drift. In **stmv**, the form of the spatial and spatio-temporal dependence of these residuals is determined from data for localized areas of interest centered on the nodes of a statistical spatial lattice and a range based upon a local variogram using a Matern formulation. It is, therefore, similar to a "Geographically Weighted Regression" (REF). However, a structured time-series model with seasonal and annual harmonic components was used to interpolate time trends at each datum inside this area of interest, using a Lognormal Generalized Additive Model (GAM; R-package "mgcv"; Wood 2006). These temporal interpolations were in turn used to inform the spatial interpolation via a localized kriging for each time slice. All parameterizations specific to the assessment can be found at:

# **Snow Crab Parameters**

Using **stmv**, the "Viable habitat" for fishable Snow Crab was modeled globally from Snow Crab trawl surveys using a binomial GAM with a logit log link function. Smoothed (thin-plate-spline) covariates were: year, year fraction (seasonality), northing and easting, depth, bottom slope, bottom curvature, bottom temperature, bottom temperature standard deviation, In(substrate grain size; mm), species composition (correspondence analysis, Axes 1 and 2) (Figures 8 and 9; see Choi et al. 2005a for more details on methods). These modeled relationships were used to predict SSE Snow Crab habitat after discretizing covariate information to a spatial resolution of 1 x 1 km grids, also using **stmv** (Figures 8 and 9). Potential Snow Crab habitat was identified as those locations where the predicted probability of finding Snow Crab was > 0.05 or when the 95% Confidence Interval (CI) of the probability of observing crab did not intersect 0 (Figure 10).

For fishable biomass, a second stage of modeling was conducted upon the positive valued estimates of abundance using the same global-local procedure, however, with a log-link. After estimation, the probability of a location being viable habitat was used as a weighting factor to these positive-valued abundance estimates to determine the fishable biomass density adjusted for viable habitat in a given location (Figure 11). The same covariates used for habitat delineation were used for abundance modeling. The numerical densities of non-commercial life stages of Snow Crab were estimated using the geometric mean of the annual Snow Crab survey stations due to insufficient time to model and estimate their distributions.

#### **PREDATION**

The predators of Snow Crab were determined using data housed in the DFO Maritimes Region Food Habits Database (Cook and Bundy 2010). This database contains the stomach contents information for more than 170,000 individuals representing 68 ground and pelagic fish species collected from various sources since 1958. There was consistent sampling of diet data in ENS between 1999 and 2016. From this data set, the predators of Snow Crab were determined, as well as the frequency with which Snow Crab have been observed as part of the predator species diet and the percent of total weight of stomach contents represented by Snow Crab. As the impact of predation relates not only to the frequency of the species consumed, but also the biomass of the predator species, the trends in biomass for the identified Snow Crab predators from the Snow Crab survey were examined. The biomass indices were presented as the geometric mean and bootstrapped confidence intervals of the area and were standardized weight for each tow (expressed as kg/km²).

#### STOCK ASSESSMENT MODEL

A modified discrete logistic model of the fishable biomass component is used to determine the relevant biological reference points (i.e., carrying capacity and fishing mortality at maximum sustainable yield, or  $F_{MSY}$ ) associated with the harvest control rules of the Snow Crab fishery. Bayesian state space methods are used to estimate the parameters of this model and associated Harvest Control Reference Points. See Appendix 2 for a general background to the Precautionary Approach (PA) and Sustainability as applied to this fishery.

# **ECOSYSTEM INDICATORS**

A multivariate data simplification method known as multivariate ordination was used to describe systemic patterns in temporal data series (Koeller et al. 2000; Brodziak and Link 2002; Choi et al. 2005a; Koeller et al. 2006) from 2005 until 2014 in Scotian Shelf Snow Crab assessments. The key environmental, social, economic and fishery-related indicators were identified and summarized annually. Indicators were made directly comparable by expression as anomalies in standard deviation units (i.e., a Z-score transformation) and then colour-coded. Missing values were coded as white. The metrics were then ordered in the sequence of the primary gradient (first eigenvector) obtained from the ordination. This allowed the visualisation of any temporal coherence in the manner in which suites of these indicators changed over time. The sequence of the indicators reflects the degree of similarity in their temporal dynamics. Specifically, a variant of Principal Components Analysis (PCA) was used that involved an eigenanalysis of the correlation matrices of the indicators, following data-normalisation of those that were not normally distributed ( $log_{10}(x+1)$  transformations were sufficient). In classical PCA, it is customary to delete all such cases (years) with missing values, but this would have eliminated much of the data series from the analysis. Instead, Pearson correlation coefficients were computed for all possible pair-wise combinations with the implicit assumption that it represents a first-order approximation of the "true" correlational structure.

In many cases, the data sources used to populate this overview have now changed (or ceased to exist completely), which has confounded the ability to keep this overview current. This approach will not be continued annually but reference herein remains to help describe the role of Snow Crab in an ever-changing ecosystem.

# LIFE HISTORY

The Snow Crab (Chionoecetes opilio, Brachyura, Majidae, O. Fabricius) is a subarctic species resident along the east coast of North America from northern Labrador to the Gulf of Maine. In the SSE, commercially fished Snow Crab are generally observed between depths of 60 m and 280 m and between temperatures of -1°C and 6°C. Snow Crab are thought to avoid temperatures above 7°C, as metabolic costs are thought to match metabolic gains (Foyle et al. 1989); however, in S-ENS Snow Crab have been observed above the "break-point" temperature. Snow Crab are generally observed on soft mud bottoms, although small-bodied and molting crabs are also found on more complex (boulder, cobble) substrates (Sainte-Marie and Hazel 1992; Comeau et al. 1998).

Snow Crab eggs are brooded by their mothers for up to 2 years, depending upon ambient temperatures, food availability and the maturity status of the mother (up to 27 months in primiparous females – first breeding event; and up to 24 months in multiparous females – second or possibly third breeding events; Sainte-Marie 1993). More rapid development of eggs (from 12 to 18 months) has been observed in other systems (Elner and Beninger 1995; Webb et al. 2007). Over 80% female Snow Crab on the Scotian Shelf are estimated to follow an annual cycle, rather than the bi-annual cycle observed in most other areas (Kuhn and Choi

2011). A primiparous female of approximately 57.4 mm CW would produce between 35,000 to 46,000 eggs, which are extruded between February and April (in the Baie Sainte-Marguerite region of the northern Gulf of St. Lawrence; Sainte-Marie 1993). The observable range of fecundity is quite large, especially as multiparous females are thought to be more fecund with more than 100,000 eggs being produced by each female. Eggs are hatched from April to June when the pelagic larvae are released. The pelagic larval stage lasts for three to five months (zoea stages 1 and 2 and then the megalopea stage) during which Snow Crab are feeding upon plankton. The larvae settle to the bottom in autumn to winter (September to October in the Gulf area). In the SSE, pelagic stages seem to have highest abundance in October and so may begin settling as late as January. Very little is known of survival rates at these early life stages.

Once settled to the bottom (benthic phase), Snow Crab grow rapidly, molting approximately twice a year (Sainte-Marie et al. 1995; Comeau et al. 1998; Figure 12). The first inter-molt stage (instar 1) is approximately 3 mm CW. After the 5<sup>th</sup> instar (15 mm CW), the molting frequency declines to annual spring molts until they reach a terminal maturity molt. Growth is allometric with weight increasing approximately 250% with each molt (Figure 7). Terminal molt has been observed to occur between the 9<sup>th</sup> and 13<sup>th</sup> instar in males and the 9<sup>th</sup> to 10<sup>th</sup> instar in females. Just prior to the terminal molt, male crab may skip a molt in one year to molt in the next (Conan et al. 1992; Figure 12). Male Snow Crab generally reach legal size (≥ 95 mm CW) by the 12<sup>th</sup> instar; however, a variable fraction of instar 11 Snow Crab are also within legal size. Male instar 12 Snow Crab represent an age of approximately nine years since settlement to the bottom and 11 years since egg extrusion. Thereafter, the life expectancy of a male is approximately five to six years. Up to ten months are required for the shell to harden (CC1 and early CC2; Table 5), and up to one year for meat yields to be commercially viable. After hardening of the carapace (CC3 to 4), the male is able to mate. Near the end of the lifespan of a Snow Crab (CC5), the shell decalcifies and softens and there may be heavy epibiont growth. In some warm-water environments (e.g., continental slope areas), epibiont growth occurs at an accelerated rate creating some uncertainty in the classification of CC5 crab.

Females reproducing for the first time (primiparous females) generally begin their molt to maturity at an average size of 60 mm CW and mate while their carapace is still soft (early spring: prior to the fishing season in ENS and during the fishing season in 4X). A second mating period later in the year (May to June) has also been observed for multiparous females (Hooper 1986). During mating, complex behavioral patterns have also been observed; the male helps the primiparous female molt, protects her from other males and predators, and even feeds her (indirectly; Hooper 1986). Pair formation (a mating embrace where the male holds the female) may occur up to three weeks prior to the mating event (Hooper 1986). Upon larval release, males have been seen to wave the females about to help disperse the larvae (i.e., prior to a multiparous mating). Females are selective in their mate choice, as is often the case in sexually dimorphic species, and they have been seen to die in the process of resisting mating attempts from unsolicited males (Watson 1972; Hooper 1986). Males compete heavily for females and often injure themselves (losing appendages) while contesting over a female. Larger males with larger chela are generally more successful in mating and protecting females from harm.

# **ECOSYSTEM CONTEXT**

#### **OVERVIEW**

An overview of some relevant social, economic and ecological factors has been used in previous Scotian Shelf Snow Crab assessments to form a basis for discussion of the place of Snow Crab in its ecosystem (for more details, see Choi et al. 2005a). See Cook et al. 2015 for

the most recent / complete table of sorted ordination of anomalies of key social, economic and ecological patterns on the Scotian Shelf relevant to Snow Crab for further information.

The first axis of variation accounted for approximately 22% of the total variation in the data, and was dominated by the influence of declines in mean body size of organisms in the groundfish surveys; socio-economic indicators of ocean use by humans and associated changes in their relative abundance: landings and landed values of groundfish (declining), invertebrates (increasing), declines in sharks and large demersals and landings of pelagic fish, and oil and gas exploration and development (increasing). Nova Scotia Gross Domestic Product (GDP) and population size were also influential factors that have been increasing. Further, the physiological condition of many groups of fish has been declining as has been the number of fish harvesters in Nova Scotia. The temporal differences along this axis of variation indicates that coherent systemic changes of socio-economic and ecological indicators occurred in the early-1990s, with some return to historical states evident.

Importantly, temperature-related changes were generally orthogonal (independent) to the above axis of variation. This second (orthogonal) axis of variation, accounting for 10% of the total variation, was strongly associated with the cold intermediate layer temperature and volume, bottom temperatures and variability in bottom temperatures, bottom oxygen concentrations and sea ice coverage.

Anecdotal information from fishers and fishery-based catch rates (Figure 4) suggests that the abundance of Snow Crab was low in the near-shore areas of the SSE, prior to 1980. Increases in catch rates were observed throughout the shelf in the mid-1980s and 1990s in N-ENS and S-ENS, respectively. As commercially exploitable Snow Crab require at least 9 years from time of settlement to reach the legal size of 95 mm CW, their increasing dominance on the shelf must have had their origins as early as the late-1970s and 1980s (N-ENS and S-ENS, respectively). For S-ENS, these timelines are confounded by the expansion of the fishing grounds towards increasingly offshore areas and the exploitation of previously unexploited crab populations. However, most of this expansion was observed in the post-2000 period when TACs and the closely associated landings increased up to six-fold relative to the TACs and landings of the 1990s and a doubling of fishing effort (Figures 2 and 3). The catch rate increases observed in the 1980s and 1990s were, therefore, likely reflecting real increases in Snow Crab abundance.

The possible causes of this change in abundance can be simplistically broken down into the following categories of explanation: connectivity (metapopulation dynamics); environment (habitat); top-down (predation); bottom-up (resource limitation); lateral (competition) and human (complex perturbations). These will be briefly discussed below.

# **CONNECTIVITY**

In the context of this assessment, connectivity refers to the manner in which various populations are connected to each other via immigration and emigration, also known as metapopulation dynamics. In the case of Snow Crab, connectivity between populations exists due to two main processes: larval dispersion in the planktonic stages and directed movement during the benthic stages.

# **Larval Dispersion**

The potential for hydrodynamic transport of Snow Crab larvae from the southern Gulf of St. Lawrence to the SSE and internal circulation on the SSE has been studied by J. Chassé and D. Brickman (Ocean Sciences Division, BIO, DFO; personal communication). Treating larvae as passive particles, simulations suggested that a large numbers of larvae can be transported onto the SSE (especially near Sable Bank and in the shallows further west). The possibility of Snow

Crab larvae entering the SSE from the Gulf of St. Lawrence region and the Labrador current cannot be ignored, especially given no genetic differences are found between all Atlantic Snow Crab populations (Pubela et al. 2008). Further, planktonic organisms can maintain their position in a single location in even very strong advective conditions via control of vertical migrations. Thus, the degree of larval retention on the SSE, while unknown, can be large.

The following observations suggest that the SSE population may be acting as an autonomously reproducing system:

- The temporal dynamics of the SSE Snow Crab population is generally out-of-phase with the
  cycles seen thus far in the southern Gulf of St. Lawrence. If the SSE was dependent upon
  the larval drift from the Gulf Region, the temporal dynamics of the populations would be inphase.
- The spatial distribution of Brachyuran larvae (Scotian Shelf Ichthyoplankton Sampling Program (SSIP) in the 1980s; see summary in Choi et al. 2005b, page 14) have been observed to be quite pervasive throughout the SSE with no spatial clines (i.e., no declines in abundance with distance from the Gulf of St. Lawrence area) as one might expect if the source of larvae were solely from the Gulf region.
- A pulse of larval abundance was observed from 1997 to 1999 with peak levels in 1998 (Choi et al. 2005b, page 14). The timing of this pulse is concordant with the growth schedules of the currently expected 'local' recruitment. Approximately nine years would be required to grow from the zoea stages to instar 11/12, the stages in which Snow Crab begin to molt to maturity in 2007, the same time difference between 1998 and 2007.
- The period in the late-1990s, when high larval production was observed, was precisely the same period in which the abundance of mature males and females on the SSE were at their peak.

The above circumstantial evidence suggests that the Snow Crab resident on the SSE may be able to function as a self-reproducing system, regardless of inputs from other systems. Even if external sources of larvae do exist, the reproductive potential of the Snow Crab resident on the SSE proper cannot be dismissed. To this end, a conservative approach to the harvest of large mature males (i.e., reduced exploitation rates) is required in this region to allow them to mate with the more rapidly maturing females. Without maintaining a strong population base of large mature males, the earlier maturing females in a recruitment pulse could face sperm limitations resulting in potential negative consequences 7-10 years subsequent.

# Movement

# **Traditional Tagging Program**

Spaghetti tags have been applied opportunistically to monitor Snow Crab movement since the early-1990s. To encourage participation, a reward program exists and an <u>online alternative for submitting the tag recapture information</u> has been developed to facilitate reporting of tag recaptures.

Movement information is primarily limited to recaptures of mature, terminally molted male crab. The application of spaghetti tags prevents molting so only mature males are tagged and tag recaptures are from the male-only Snow Crab fishery. Results suggest that although crab movements are quite variable, the potential connectivity between regions is still high (Figure 13).

Short-term seasonal movement patterns remain unidentified and are a source of uncertainty. Long term movement patterns are more easily observed. Two distinct patterns of movement

have been identified for commercial Snow Crab, one marked by above average rates of movement for a segment of a population (Figure 14). Also, there are two distinct time periods (2-4 years each) within the time series where appreciable increases in average movement rates were observed. In both cases, the mature crab population was male dominated with mature females being low in S-ENS and almost non-existent in N-ENS. This suggests that reproduction is a key factor influencing the movement of mature male Snow Crab in the region. Substantial emigration was observed from N-ENS to the Gulf (CFA 12 and CFA 19) during these periods. Unfortunately, no mechanisms existed to observe immigration into N-ENS as no crab were tagged in the Gulf for an extended period of time. The movement of immature and female crab is not known and remains a source of uncertainty. Additional analysis of potential factors influencing patterns of short and long term movement patterns is required.

Since 2004, 22,488 tags have been applied and 1,627 distinct crab (7.2%) have been reported (Table 6) in N- and S-ENS. An unknown (and potentially large) proportion of tag recaptures remain unreported. These unreported captures negatively impact the understanding of movement patterns. Even with potential tagging-related mortality and exploitation rates of 15-30%, a much higher (than 7.2%) proportion of tags are likely recaptured. Anecdotal information suggests that fishers do not always report recaptures. Since 2004, there have been 171 individuals who have reported recaptures and there have been 1,748 total recaptures (Table 6) of 1,627 crab. On average, each person participating has reported ten or more different captures. Other fish harvesters, operating in close proximity to these individuals, have not reported any tag recaptures.

Of the 1,627 distinct tags recaptured, 1,081 have been returned to the water and 103 of these have been captured again. Tracking tagged crab over multiple recaptures provides further insight into the movement patterns over the life cycle of Snow Crab. When subsequent recaptures are reported, all people who previously captured that particular crab are notified to encourage returning tagged crab to the water.

Crab recaptured within 10 days of initial release are not included in analyses. This short-term movement could be directly influenced by other factors such as water currents drifting crab as they settle to the bottom after release. Traditionally, the movement of tagged animals (e.g. Snow Crab) is stated as a straight line distance between release and recapture locations. This distance traveled calculation is now constrained by depth ranges of 60-280 meters. This depth range is considered to be a more conservative estimate of Snow Crab habitat use as compared to previous methods ignoring habitat preferences. On average, crab tagged between 2004 and 2017 were first recaptured in the season following the tagging event (mean time to recapture was 455 days), with the longest time interval between release and initial capture being 2,278 days (approximately 6 years, 3 months; Figure 14). This crab had moved at least 132 km in that period. Very few [reported] recaptures occur beyond 2 years of the tagging event. Most tagging is done on a commercial fishing vessels engaged in crab fishing operations, so tags are generally applied where commercial crab concentrations and resulting harvesting is high. This high localized exploitation may explain the majority of the recaptures being from crab captured in the same or following season after tagging. As such, much higher recaptures and reporting are expected.

The locomotory ability of Snow Crab can be very large, as the average distance traveled was 27 km, with a maximum distance traveled of 504 km (Table 6). The average rate of movement was 1.8 km/month. These distances and rates are most likely underestimates as the actual distance traveled by the crab will be greater due to the topographical complexity and the meandering nature of most animal movement. On average, crab captured in S-ENS have a "shortest path" (habitat constrained) movement rate of 2.12 km/month, slightly higher than N-

ENS of 1.78 km/month. In 4X, the displacement rate is slightly lower again at 1.20 km/month (Table 7).

From 2004-2017, movement between N-ENS and S-ENS was seldom observed. In total, 11 crab tagged in S-ENS were recaptured in N-ENS and 5 crab tagged in N-ENS were recaptured in S-ENS. These numbers may be underestimates of total movement due to non-reporting of recaptures (Figure 13).

Returns from crab tagged between 2010 and 2014 suggest significant movement from N-ENS into the southern Gulf of St. Lawrence ("the Gulf", Figure 13). The apparent unidirectional nature of this movement (from N-ENS to the Gulf) is confounded by the fact that there had been a period of no tagging in the Gulf Region during this period of time. As such, the true degree of connectivity between the Gulf and N-ENS remains unknown, and may be substantial given the high concentrations of commercial crab in the adjacent Area 19 (M. Moriyasu, personal communication). It is hoped that the renewed tagging program in Area 19 (a joint effort of the Maritimes and Gulf DFO regions) will provide further insight into the dynamics of Snow Crab movement between these regions.

Reporting of tag recaptured in 4X is believed to be much higher than other areas (Figure 15), due to the small size (5-6 boats) and high engagement of the 4X Snow Crab fleet. Of the 971 tags deployed in 4X since 2008, 99 (10%) have been captured at least once. Of these, 12 (12%) were captured a second time, 5 (41%) of the 12 were captured a third time. There has yet to be any substantial movement observed between 4X and S-ENS. With high participation and low emigration, one would expect a higher return rate for initial capture. Mortality due to warming events may be a contributing factor (Zisserson and Cook 2017).

It is recommended that recaptured tagged crab be released immediately with the tag still attached after relevant data are recorded (date, location, depth, condition of crab, as well as information about the vessel and individual who recaptured the tag). To view the movement data in more detail go to ENS Snow Crab website and click on the tagging tab.

# **Acoustic Tagging Program**

Since 2013, acoustic tags have been applied to Snow Crab within and adjacent to N-ENS. A comprehensive methodology for the application of acoustic tags on Snow Crab has been developed (Zisserson and Cameron 2016). Acoustic receivers, both stationary and mobile, recognize and record whenever a Snow Crab with an acoustic tag approaches the receiver. To date, the majority of the acoustic tags were attached to terminally molted, mature male Snow Crab though 6 have been applied to mature female Snow Crab in CFA 23, near N-ENS, and 6 in CFA 19. None of the female crab have yet been detected. The acoustic tagging program allows for the potential discrimination of movement patterns without the need for recapture of the tag through commercial fishing activities. As such, personal motivations to report (or not report) tag recaptures do not bias movement data. Seasonal movement patterns into N-ENS from adjacent areas have long been hypothesized by the fishing industry in N-ENS. Acoustic receiver arrays between N-ENS and the Gulf and also N-ENS and CFA 23 may help describe these movement patterns.

In the summer of 2013, 27 acoustic tags were deployed in N-ENS. In just over a year, 10 of these tags were detected on the Cabot Strait Line (essentially separating N-ENS and the Gulf) and 3 of these were later detected within the Gulf Region (Figure 16). This tagging was repeated in 2015 at the same locations. Interestingly, as of yet, none of these crab have been detected within, or near, the Gulf Region. In fact, 23 of the 27 released crab were since detected, all within 15 nautical mile of the release locations. This supports the episodic nature of connectivity between the Gulf and N-ENS, further supporting this result derived from

spaghetti tag movement data. Forty (40) acoustic tags were released in the Glace Bay Hole area of N-ENS in 2015. Detections of these animals have all been from within N-ENS.

Acoustic tags have been released in the areas adjoining N-ENS to help determine if the movement is unidirectional or bidirectional. Fifty-seven (57) tags were released in the Gulf Region (CFA 19) since 2015, with no detections in N-ENS to date. Seventy (70) tags were release in S-ENS (CFA 23) since 2015, also with no detections in N-ENS.

In 2017, 10 crab with acoustic tags were released near the CFA 4X and CFA 24 boundary. Frequent glider activity in the area should result in high detection rates of these animals.

If reproduction is in fact the main driver of movement patterns, we would expect to see limited levels of emigration from N- or S-ENS in the near future as mature female abundance is currently high and expected to remain high for the next few years.

# **ENVIRONMENTAL CONTROL (HABITAT)**

Known environmental (abiotic) influences upon Snow Crab include substrate type, temperature variations, and oxygen concentrations. Altered temperature conditions over extended periods of time have been observed in the SSE. For example, prior to 1986, the Shelf was characterized by relatively warm bottom temperatures, low volume of the cold intermediate layer, and a Gulf Stream frontal position closer to the continental shelf. The post-1986 period transitioned to an environment of cold bottom temperatures, high volume of the cold-intermediate layer, and a Gulf Stream frontal position distant from the shelf. The principal cause of the cold conditions is thought to have been along-shelf advection from both the Gulf of St. Lawrence and southern Newfoundland, and local atmospherically-induced, cooling. In the southwestern areas (Emerald Basin), the offshore warm slope water kept subsurface temperatures relatively warm throughout the 1980s and 1990s, the exception being in 1997-1998, when cold Labrador Slope Water moved into the region along the shelf break and flooded the lower layers of the central and south western regions. While this event produced the coldest near-bottom conditions in these shelf regions since the 1960s, its duration was short, lasting about one year.

Bottom temperatures in the distributional centers of S-ENS Snow Crab have been increasing consistently since the early-1990s (Figures 17, 18 and 19). North-Eastern Nova Scotia (N-ENS) shows a relatively more stable bottom temperature field though still exhibits a slight rising trend. In 4X bottom temperatures continue to be generally warmer and more erratic than the other areas. Increasing temperatures can have multiple effects on Snow Crab populations. Bottom temperatures affect most instars of Snow Crab phenology though the very earliest (pelagic larvae) instars are directly affected by temperatures in the upper water column. Within acceptable temperature ranges, warmer temperatures can result in larger mature animals, hypothesized to be caused by decreased intermoult interval with warmer temperatures (Burmeister and Sainte-Marie 2010; Dawe et al. 2012). Larger mature females could also increase individual fecundity (Sainte-Marie et al. 2008). Unfortunately, these positive effects of minor temperature increases are likely mitigated or over-shadowed by more pronounced temperature changes which increase mean bottom temperatures into a range less suitable for Snow Crab. This can (and has) caused a northward shift of the overall stock's distribution in both the Atlantic (Agnalt et al. 2010; Burmeister 2010) and Pacific (Orensanz et al. 2004). Temperature driven biomass decreases in local Snow Crab populations have already been observed on the Scotian Shelf. Both abundance estimates and catch rates declined sharply in CFA 4X (the southernmost Snow Crab population in the Western Atlantic) following a warm water event in 2012/13 (Zisserson and Cook 2017) and have failed to return to levels previously observed. Outside of direct biological effects on Snow Crab and their distribution, temperature changes potentially create new ecosystem regimes that affect Snow Crab's relative role within

the benthic community. These changes can manifest as changes in predation, food availability, lateral competition, invasive species, etc.

Overall, the potential Snow Crab habitat in the SSE for 2017 was below the long-term mean. All areas have potential habitat at the lowest level observed in the past 20 years (Figures 19 and 20).

# **TOP-DOWN CONTROL (PREDATION)**

Top-down influences refer to the role of predators in controlling a population (Paine 1966; Worm and Myers 2003). The capacity of predatory groundfish to opportunistically feed upon Snow Crab, in combination with their numerical dominance prior to the 1990s, suggests that they may have been an important regulating factor controlling the recruitment of Snow Crab. For example, Snow Crab in the size range of 5 to 30 mm CW (with a 7 mm CW mode; that is instars 2 to 7, with instar 7 being strongly selected) were targeted by Thorny Skate and Atlantic Cod (Robichaud et al. 1991). Soft-shelled males in the size range of 77 to 110 mm CW during the spring molt were also a preferred food item. The demise of these predatory groundfish in the post-1990 period, and the resultant release from predation upon the immature and soft-shelled crabs, may have been an important determinant of the current rise to dominance of Snow Crab in the SSE. As the occurrence of Snow Crab (relative to other species) changes within the ecosystem, so does their potential role as both a predator and prey species (Boudreau and Worm 2012).

The known predators of Snow Crab in the SSE were, in order of importance: Atlantic Wolffish (*Anarhichas lupus*), Atlantic Halibut (*Hippoglossus hippoglossus*), skates (Smooth Skate *Malacoraja senta*, Thorny Skate *Raja radiata*, and Winter Skate *Leucoraja ocellata*), Longhorn Sculpin (*Myoxocephalus octodecimspinosus*), Sea Raven (*Hemitripterus americanus*), Atlantic Cod (*Gadus morhua*), White Hake (*Urophycis tenuis*), American Plaice (*Hippoglossoides platessoides*), and Haddock (*Melanogrammus aeglefinus*). From this data, the overall level of predation on Snow Crab appears to be negligible on the SSE as only Atlantic Halibut and Atlantic Wolfish have Snow Crab observed in more than 1% of the stomachs sampled (Table 8). This constitutes less than 1.5% of diet by weight within each species, particularly compared to other regions where the frequency of observing Snow Crab as prey is often greater than 10% (Robichaud et al. 1989, 1991). The unintended removal of 32 stations (see Methods: Research Survey Data section for details) on the continental slope edge in CFA 23 for the 2017 survey, likely reduced the apparent mean densities of some Snow Crab predators. This unsampled area often has high localized densities of Atlantic Cod and skate species.

Atlantic Halibut biomass has increased, particularly in S-ENS, suggesting that the total number of Snow Crab consumed may be increasing in relation to this predator (Figures 21 and 22). Only Snow Crab <65 mm CW are typically observed in fish stomachs because maximum span exceeds the predators' mouth gape (Chabot et al. 2008). A proliferation of halibut, particularly the largest fish with large mouth gapes, could create predation on larger Snow Crab seldom experienced previously. Anecdotal reports of large Atlantic Halibut with multiple mature female Snow Crab in their stomachs support this assertion. Increased predation of mature female crab could impact the reproductive potential Scotian Shelf Snow Crab.

Atlantic Wolfish are first in order of importance as a potential Snow Crab predator, however, their biomass indices suggest that they are currently at low levels across all areas (Figures 23 and 24). If the Snow Crab survey is more reflective of predators in Snow Crab habitat (vs. Groundfish surveys), the biomass of Thorny Skate (Figures 25 and 26) and Smooth Skate (Figures 27 and 28) may be greater across all areas than previously thought.

In many other areas, cod have been shown to be an important predator of Snow Crab (Bailey 1982; Burgos et al. 2013; Chabot et al. 2008; Lilly 1984; Orensanz et al. 2004; Robichaud et al. 1989, 1991). Boudreau et al. (2011) suggest that the top-down control effect of cod on Atlantic Canadian Snow Crab is most prevalent on older juvenile and sub-adult Snow Crab. Conversely, diet studies on the Scotian Shelf have not demonstrated cod to be a prevalent predator of Snow Crab (Table 8). Moreover, the Atlantic Cod populations on the SSE are currently at reduced biomass index levels in all regions relative to historic levels (Figures 29 and 30); however, there have been increases in recent years in S-ENS (cfasouth; Figure 30). Haddock may represent an additional increasing source of predation in localized areas of S-ENS and particularly 4X (Figures 31 and 32)

The only predator species that strongly co-associated with Snow Crab based on their abundance were American Plaice, likely due to the difference in habitat preferences of the other predator species (Figure 33 and 34). Due to the American Plaice's small mouth gape size and mode of feeding, they will only be capable of consuming early instar Snow Crab. Reports of Snow Crab predation by squids, seals and other crabs have been made (Bundy 2004); however, their relative impacts are not known.

Predation levels upon small immature crabs are also likely to be on the rise with the reestablishment of some groundfish populations (based on Snow Crab survey) and changing temperature fields. High local densities of groundfish are found in areas where small immature crab are found in high densities. A change in the size structure of predator populations (towards larger body sizes) could shift predation to include larger Snow Crab as well, especially during the period immediately post-molt. Overall predation mortality from groundfish does appear to be an increasing source of mortality for Snow Crab on SSE.

Seals are considered by fishers to be a potential predator of Snow Crab, and their continued increase in abundance (Figure 35; DFO 2017a) is a source of concern for many fishers. Diet studies of Grey Seals in the early 1990s (Bowen and Harrison 1994) found that evidence of crab species were found in <1% of the seal scat samples examined with a diet focusing predominantly on Sand Lance, Atlantic Cod and flatfishes. While grey seals have on occasion been observed with Snow Crab in their stomachs, it should also be emphasized that some of the highest concentrations of Snow Crab are found in the immediate vicinity of Sable Island, an area where the abundance of Grey Seals is extremely high. The actual evidence indicating that seals have a negative influence upon the Snow Crab population, therefore, seems to be minimal. In fact, it is quite possible that seals and other marine mammals may be having a positive influence by physically importing food and food waste (Katona and Whitehead 1988) from other more distant areas to the immediate vicinity of Sable Island, so indirectly "feeding" the Snow Crab and also removing potential predators of crab (in both early pelagic and benthic stages).

# **BOTTOM-UP CONTROL (RESOURCE LIMITATION)**

Bottom-up influences refer to changes in a population due to resource (food) availability. Diet studies and field observations (Hooper 1986) indicate that the primary food items of larger (mature) crab are, in order of importance: echinoderms, polychaete worms (*Maldane* sp., *Nereis* sp.) and other worm-like invertebrates, detritus, large zooplankton, shrimps, smaller juvenile crabs (Rock Crab, *Cancer irroratus*; Toad Crab, *Hyas coarctatus*; Lesser Toad Crab, *Hyas araneus*), Ocean Quahog (*Artica islandica*), bivalve molluscs (e.g., *Mytilus edulis*, *Modiolus modiolus*), brittle stars (*Ophiura sarsi*, *Ophiopholis aculeata*) and sea anemones (*Edwardsia* sp., *Metridium senile*). Smaller Snow Crab have been observed to feed upon, in order of importance: echinoderms, polychaete worms, large zooplankton, detritus and bivalves (e.g., *Mytilus edulis*, *Modiolus modiolus*, *Hiatella arctica*). Squires and Dawe (2003)

demonstrated that males appear to be more capable predators than females and consume more small fish than female crab. Studies have also demonstrated that cannibalism occurs within Snow Crab populations. Cannibalism between cohorts is size selective with instars VIII and IX being a dominant predator on instar I individuals (Emond et al. 2015). It is also highly prevalent in intermediately sized (morphometrically) mature female crabs (Sainte-Marie and Lafrance 2002; Squires and Dawe 2003). This cannibalistic behavior can create an important source of density dependent mortality.

Certainly the rapid rate of increase in abundance of Snow Crab would seem to indicate that resource competition was not a limiting factor (up to the late-1990s).

Annual chlorophyll a levels for 2016 were low throughout SSE. The spring phytoplankton bloom was delayed and of a lower magnitude on the Scotian Shelf, with a shorter length in the central portion and average length in the eastern portion (DFO 2017d). The shift in species structure of the zooplankton on the Scotia Shelf has continued into 2016 with low abundance of the energy rich *Calanus finmarchicus*.

The distribution of Northern Shrimp (*Pandalus borealis*) on the Scotian Shelf appears to remain broad (Figure 36); however, Snow Crab survey shrimp densities (Figure 37) and stock-specific stock assessment results (DFO 2017b) suggest that the SSE stock is in a declining state.

# LATERAL CONTROL (COMPETITION)

Lateral (and internal) influences refer to the competitive interactions with groundfish, other crab species, cannibalism and reproduction-induced mortality (direct and indirect). The diet of Snow Crab overlap in many ways with that of some groundfish species; thus, the demise of these groups in the late-1980s and early-1990s would have been doubly beneficial to Snow Crab through the reduction in predation pressure and also resource competition. The spatial distribution of Snow Crab overlaps with that of basket stars, sea cucumbers, Sand Lance, Capelin and Toad Crab. Some of these species may be competitors of Snow Crab for food and habitat space. There were no strong negative relationships between Snow Crab and other bycatch species (Choi and Zisserson 2012), suggestive of little competitive interactions. The potential competitors, Lesser Toad Crab (Figures 38 and 39) and Jonah Crab (Figures 40 and 41), remain in relatively patchy distributions and, therefore, do not currently appear to pose much threat to the overall health of the Snow Crab stock. Steady increases in near-shore lobster populations in the past 10 years (DFO 2017c) may increase resource competition (and even predation) for juvenile Snow Crab whose habitat preferences overlap those of lobster.

#### DISEASE

Bitter crab disease is observed in crustaceans throughout the world, though most-commonly in the northern hemisphere (Stentiford and Shields 2005). The name arises from the bitter (aspirinlike) taste, which infected animals exhibit once cooked, rendering them unmarketable. Bitter crab disease infections in Snow Crab have been observed in Alaska, Newfoundland, Greenland, and most recently on the Scotian Shelf (Morado et al. 2010). In Atlantic Canada, BCD infected Snow Crab were first observed in Bonavista Bay in 1990 (Taylor and Khan 1995), though the range of infection now extends from southern Labrador to the southern Grand Banks. Infected animals are rare on the southern and western coast (Dawe et al. 2010) of Newfoundland in the waters most proximal to the Eastern Scotian Shelf (ESS). Salinity levels and water temperature, as well as ocean currents (affecting the distribution of both crab larvae and the water-borne *Hematodinium*), are potential limiting factors of disease prevalence (Morado et al. 2010). Infected Snow Crab were first observed on the Scotian Shelf in the 2008 Snow Crab trawl survey, with a handful of anecdotal reports of infected crab having been seen

in the commercial catch in the near-shore areas previous to 2008. The fall survey timing is advantageous to detection as animals infected during the spring molt are expected to show visible signs of infection by the fall. Visible identification of infection can be confounded by examination of infected animals in early stages of (not yet showing visible) infection earlier in a given year.

This disease is caused by a parasitic dinoflagellate of the genus *Hematodinium*. It infects an animal's haemolymph (blood), gradually dominating the animal's haemolymph and resulting in reduced numbers of haemocytes in the blood and the ability of the organism to transport oxygen. Infection appears to take place during molting, and virtually all infections appear to be of animals that have molted within the past year (new shell). As such, there is a high likelihood of infection in juvenile animals as they molt frequently. It is not known if animals infected with *Hematodinium* will always develop the disease. It is considered fatal and assumed to kill the host organism within a year. Infected animals appear lethargic or lifeless, and they have a more reddish ("cooked") appearance, dorsal carapace with an opaque or chalky ventral appearance, and a milky haemolymph appearance. Depending on the severity of the infection, it is readily identified visually. Polymerase Chain Reaction (PCR) laboratory assay performed on an alcohol-fixed haemolymph sample was considered by some researchers to be the definitive test of animal infection. However, the use of this laboratory approach from SSE Snow Crab appears to both costly and unreliable. As such, based on observational experience and seasonality of the survey, visual identification is now considered to be the most reliable method.

The number of visibly infected animals has remained constant and at low levels with prevalence rates near 0.1% (Table 9). Crab of both sexes have been observed with BCD in all areas (Figure 42) across a wide range of sizes (20-100 mm CW; Choi and Zisserson 2012), though generally, in immature animals well below legal commercial size (Figure 43). Mature, oldershelled crab infected with BCD have yet to be observed in the region. This suggests that infection may be linked to molting and that it increases mortality rates substantially. The pulsed nature of ESS Snow Crab populations can cause apparent infection rates to climb when larger segments of the population are found in smaller size classes.

### **HUMAN INFLUENCE**

The human influence is a quite complex mixture of the above controlling influences exerted both directly and indirectly upon Snow Crab. Directed fishing for Snow Crab is discussed in the next section (fishery assessment). Here, other forms of human influences are discussed.

# **Bycatch of Snow Crab in Other Fisheries**

The spatial distribution of Northern Shrimp (*Pandalus borealis*) largely coincides with that of Snow Crab, and so this fishery represents a potential source of additional Snow Crab mortality through incidental bycatch. The use of trawls by the shrimp industry is of particular concern as they can cause co-incident damage of Snow Crab, especially those susceptible to crushing, such as crab in newly molted soft-shelled stages. This is particularly relevant as areas with high shrimp fishing activity are the same areas with the highest catch rates and landings of Snow Crab. The inshore American Lobster (*Homarus americanus*) fishery may also represent a source of juvenile and adult female Snow Crab mortality in some areas, as anecdotal reports suggest capture in lobster traps and (illegal) use as bait. This has been stated by fishers to be more prevalent in 4X, as well as some limited areas along the Eastern Shore of Nova Scotia during the early part of the lobster season in April. This bycatch of Snow Crab in the lobster traps generally occurs only when cold bottom water temperatures coincide with lobster fishing efforts in near-shore areas. Additionally, bycatch of Snow Crab in Danish seines has been

anecdotally reported from the limited flatfish fisheries on the Scotian Shelf, though this fishing method is seldom used currently.

# **Bycatch of Other Species in the Snow Crab Fishery**

At-sea-observed estimates of bycatch of other species in the commercial catch of the SSE Snow Crab fishery can be extrapolated to the entire fleet based on landings and the proportion of landings observed (Tables 10 and 11). In ENS, a total of 7,532 t of Snow Crab were landed in 2017 with associated estimates of bycatch at 1.9 t. Bycatch rates in ENS are traditionally very low and 2017 levels of 0.03% continue this trend. The 2017 bycatch estimates continue to show more species diversity than in the past. This could be an early indicator of a shift away from the macro-invertebrate domination of the Scotian Shelf observed since the 1990s.

Crab Fishing Area (CFA) 4X had a total estimated bycatch of 0.2 t associated with 80 t of Snow Crab landings (0.2%). Crab Fishing Area (CFA) 4X traditionally shows higher (relative to ENS) bycatch rates due to lower densities of commercial Snow Crab and a higher species diversity in some of the fishing grounds. In 2013 and 2014, 4X bycatch rates were unusually high (relative to past seasons) due to very low catch rates and increase in searching to locate commercial Snow Crab. These search activities increase fishing effort in non-traditional fishing grounds with higher densities of species other than Snow Crab. The hyper-constriction of fishing effort to the eastern-most portion of 4X in 2015 and 2016, likely resulted in lower bycatch levels.

The low incidence of bycatch in commercial catch of the SSE Snow Crab fishery can be attributed to:

- Trap design top entry conical traps excludes many fish species.
- Passive nature of fishing gear as opposed to other gear types, such as trawl nets (also increases survival of bycatch discards).
- Large mesh-size of trap netting (at a minimum 5.25" knot-to-knot).

The majority of bycatch for all areas is generally composed of other invertebrate species (e.g., Northern Stone Crab (*Lithodes maja*) and American Lobster) for which higher survival rates can be expected after being released, as compared to fin fish discards. In ENS, Northern Wolfish and Spotted Wolfish, both *Species at Risk Act* (SARA)-listed species with "Threatened" status", have been observed in the bycatch of fishery in at least one of the past three seasons. Striped Wolfish (SARA-listed species of "Special Concern") have been observed in each of the past three seasons. The catch of all three species was at extremely low levels. Their prevalence in Snow Crab catches will continue to be monitored.

# Oil and Gas Exploration and Development

Oil and gas exploration and development has, and continues, to occur on the Scotian Shelf near to, or upstream of, major Snow Crab fishing grounds and Snow Crab population centers in both N-ENS and S-ENS. Seismic surveys are used by the oil and gas industry to identify areas of petroleum resource potential beneath the seafloor (Breeze and Horsman 2005). The effects of offshore oil and gas seismic exploration on potentially-vulnerable components of the Snow Crab population (e.g. eggs, larvae, and soft-shelled crab), as well as on the long-term biological development and behaviour of this long-lived species, are still not known (DFO 2004; Boudreau et al. 2009; Courtenay et al. 2009). However, anecdotal evidence following seismic exploration that occurred in November 2005 over the Glace Bay Hole and the shallows of the Sydney Bight (i.e. Hunt Oil 2005; Husky Energy 2010), where immature and female crab are generally abundant, suggested that seismic may have impacted the Snow Crab population proximal to the exploration program. The Canada-Nova Scotia Offshore Petroleum Board (CNSOPB), the

regulator that oversees the petroleum industry that operates in the offshore of Nova Scotia, has issued a Call for Bids for offshore exploration in N-ENS and S-ENS in 2017-2019 (Figure 44), as part of its current three year plan (CNSOPB 2017). The exploration block for 2017 includes most of N-ENS and CFA 23, for 2018 a block west of Sable Island and for 2019 an adjacent block west of The Gully. Future seismic exploration in offshore areas occupied by Snow Crab may need to evaluate the impacts on the species.

#### **Undersea Cables**

Undersea cables have been identified by fishers as another source of concern, in particular, the Maritime Link subsea cables in N-ENS. Two subsea High Voltage DC Cables now span approximately 180 km from Cape Ray, Newfoundland, to Point Aconi, Nova Scotia (Emera 2013), to transport electricity from the Lower Churchill Hydro-electric project. These cables were laid in the spring of 2017 directly through some of the most productive Snow Crab fishing grounds of N-ENS. The two 4' diameter cables are spaced by at least twice the water depth at a given location. Trenching to a minimum of 1 meter below the seafloor through spatially-specific jet benthic fluidizing (20 cm path for each cable; EMERA 2016) should lower the likelihood of a physical barrier to movement being created, as opposed to other more destructive and expansive methods of cable trenching. The cables may, however, create a barrier to normal Snow Crab movement through static magnetic fields (and/or associated) induced electrical fields or increased temperature (generated by the resistance of flow through cables). At present, there is no information that can be presented to definitively describe their effects upon Snow Crab. Once energized, Emera will conduct a survey in crab habitat to confirm the Electo-Magnetic Field (EMF) intensity around the cables. (J.-M. Nicholas, personal communication, EMERA Newfoundland and Labrador).

Additional tagging effort has been undertaken in this area since 2013 (see above section on Movement). It will be useful to understand the natural movements of Snow Crab into and out of this area prior to the installation of the undersea cable.

# **Socio-Economics**

A coherent change in many socio-economic indicators occurred in the mid-1990s, in the same time frame as the large-scale changes in the Scotian Shelf ecosystem (see Figure 13, Choi and Zisserson 2012). In general, the demographics of Nova Scotia shifted toward an older and more affluent population base with the ageing of the "baby-boomers". The total population size has also been increasing over the historical record to approximately 943,000 people in 2014, as well as a trend toward a population with higher levels of education. Nova Scotia's GDP (Gross Domestic Product) has also been increasing along with the GDP associated with oil and gas exploitation and the number of cruise ships visiting Halifax. These demographic changes are associated with a greater biological demand for fishery resources, locally and as exports.

Amongst the more fishery-related indicators, there has been an increased importance of invertebrate fisheries with the demise of the groundfish in the early-1990s, both in terms of total landings and landed values of the fisheries. The number of shellfish closures has increased over time. However, the relative importance of fishing to the Nova Scotia GDP and the total number of fish harvesters has both been on the decline.

The fished species have changed greatly since the early-1990s in conjunction with the rapid changes in species dominance structure. Since this time, total groundfish landings have declined, falling from 281 kt in 1991 to 44 kt in 2015 for the province of Nova Scotia. Similarly, the pelagic fish landings have decreased from 125 kt in 1990 to 51 kt in 2015. In contrast, invertebrate landings have increased from 111 kt to 262 kt since the 1990s, as has the total

landed value for all fisheries combined, increasing from \$445 million in 1990 to \$1.2 billion in 2015.

The links between the socio-economic changes observed and the changes in the Scotian Shelf Ecosystem are complex. However, an important issue to consider is whether alterations in social and economic structure can assist in the continued evolution of precautionary and ecosystem-based management of a sustainable and viable Snow Crab fishery. Certainly, transparency in management, communication by science and a unity of voice of fishers with a long-term vision for their resource can definitely assist, as has been the experience in S-ENS in the post-2004 period – a success that merits emphasis. Maintaining and fostering these positive determinants of stewardship is essential for the continued social, economic and ecological sustainability of this fishery.

# **Marine Protected Areas**

St. Anns Bank area has been designated as a Marine Protected Area (MPA) in 2017 pursuant to the *Oceans Act*. The MPA is subdivided into four zones (Figure 45). The majority of the MPA (Zone 1) is a core protection area. The remaining (smaller) 3 zones are referred to as "adaptive management zones", which allow limited human activity to occur within their boundaries. The presence of a refuge from fishing activities is always positive as it serves as a fallowing area. However, if the protection is disproportionately beneficial to other organisms, be they predators of Snow Crab or prey items, the effects upon Snow Crab can be mixed. The long-term effects of an MPA cannot be determined at this point.

The Snow Crab survey continues to operate within the St. Anns Bank and the Gully MPAs, providing data on the co-occurrence of Snow Crab and other species within these areas. Increased sampling survey catches (fish lengths, weights, and dietary analysis) occurs at reference stations within and immediately outside the MPA boundaries.

# **FISHERY**

# **Effort**

In N-ENS, a spring season was introduced in 2008 in an effort to reduce soft and white crab capture and handling, and now represents the majority of the fishing efforts. This season was in addition to the traditional summer season and individual fishers are able to fish during either (or both) season. After a successful trial in 2008, landings associated with spring fishing efforts peaked at 91% in 2010 and had remained above 65% of landings since that time with the exception of 2014 and 2015 when sea ice conditions limited spring fishing efforts (Figure 46). Total effort increased substantially in N-ENS in 2017 (Figure 2) due to increased TAC. The 2017 fishing effort (Figure 47) was again focused on the trench of deep water located along the northeastern coast of Cape Breton ("inside") with increased relative effort in the Glace Bay Hole (as compared to 2016). For the first time since 2012, some fishing (albeit limited) occurred on the northern-most portion of N-ENS along the CFA 19 boundary line. The number of vessels active each season in N-ENS remains relatively stable (Figure 48).

In S-ENS, fishing effort continues to be focused on offshore fishing grounds (Figure 47). Much of the fishing effort in CFA 23 still continued to be focused on the holes found between Misaine and Banquereau banks, though effort was observed in the inshore/ mid-shore "bad neighbours" area particularly during the spring. Crab Fishing Area (CFA) 24 showed a similar fishing pattern to the previous year with spring fishing occurring primarily north of Sable Island and between Middle and Canso banks. Less fishing effort (relative to past years) occurred immediately adjacent to the CFA 23 boundary line. There was an almost complete absence of effort in the

western-most portion (along the "Eastern Shore") of CFA 24 (west of 61.5° Longitude) and in the area proximal to Chedabucto Bay.

In both CFAs 23 and 24, fishing patterns were affected by an overlap with spring fishing activities for shrimp as the Snow Crab fleet has limited access to some of the most productive Snow Crab fishing zones throughout the spring months, due to area closures ("shrimp boxes"). When these areas open to the Snow Crab fleet in the early summer, the majority of fishing effort occurs within these shrimp boxes. Previous to 2010, less than 20% of S-ENS landings occurred prior to July 1<sup>st</sup>, whereas now over 50% of total landings consistently occur in this spring period. Crab Fishing Area (CFA) 24 consistently shows a higher percentage of spring landings as compared to CFA 23 (Figure 46), possibly indicating that CFA 23 is more affected/ limited by spring "shrimp box" closures.

In S-ENS, the number of active vessels has shown a decreasing trend since 2009 (Figure 48). The current number of active vessels is approximately 50% lower than the pre-2010 period. This reduction is due to many licenses partnering and license holders choosing to lease their quota for the year rather than fishing it themselves. This raises concerns when hired captains and crews potentially have no long-term stake in this fishery. Such individuals may not follow proper handling protocols for discarded crab, fish in strategic ways to avoid soft-shelled crab capture and choose not to report tagged crab essential to proper movement studies. The vessel chosen to fish a license holder's quota may be driven by price, with perhaps less concern for experience of the captain and crew and their regard for conservation-minded harvesting.

In 4X, the fishing effort was again focused almost exclusively south of Sambro, proximal to the 4X/CFA 24 line. (Figure 47).

In 2017, a total of 9,000 and 71,500 trap hauls were applied in N-ENS and S-ENS, respectively. In 2016/2017, a total of 3,200 trap hauls were applied in 4X (Tables 2-4; Figure 2).

# Landings

Landings in 2017 for N-ENS and S-ENS, were 813 t and 6,719 t, respectively, and they were 80 t in 4X for the 2016/2017 season, representing an increase of 280% (N-ENS) and decreases of 30% (S-ENS) and 47% (4X) relative to the previous year (Figures 3 and 49). Total Allowable Catches in 2017 were 825 t, 6,730 t and 80 t in N-ENS, S-ENS and 4X, respectively. The majority of N-ENS landings came from the inner trench. Crab Fishing Area (CFA) 23 saw a landings pattern distributed between the near shore and off shore with the strongest concentration of landings offshore. Mid-shore and offshore areas in CFA 24 accounted for the majority of landings in 2017. In 4X, landings (2016/2017) were exclusively caught toward the 4X/CFA 24 line (Figure 49).

#### Catch Rates<sup>1</sup>

Catch rates declined in all CFAs from the previous year. Non-standardized catch rates in 2017 were 90 kg/trap haul in N-ENS, 94 kg/trap haul in S-ENS, and 25 kg/trap haul in 4X in 2016/2017 – which relative to the previous year represents decreases of 18%,11% and 19%, respectively (Figure 4; Tables 2-4). The effect of TACs on catch rates can confound direct comparison over time and between management areas.

<sup>&</sup>lt;sup>1</sup> Please recall the caveats about catch rates being inappropriate indicators of fishable biomass, as discussed in the Methods section above.

In N-ENS, the 2017 catch rates were 90 kg/trap, a decrease relative to 2016 (110 kg/trap). N-ENS catch rates remain well above the 15 year mean (76 kg/trap; Table 2; Figure 4). Catch rates in N-ENS have been very similar to those observed in S-ENS since 2011. Catch rates in N-ENS were universally higher in the Glace Bay Hole area as opposed to the "inside" where catch rates were more variable (Figure 50). Fishers felt that a 2 km wide exclusion zone through productive crab grounds, due to Emera cable laying activities, potentially negatively impacted catch rates. Previous to 2011, catch rates in N-ENS were often quite variable throughout the entire area with pockets of high or low catch rates. Catch rates from the summer fishery were stable over time and somewhat lower than those experienced in the spring fishery in both 2016 and 2017 (Figure 51). The 2017 spring fishery catch rates showed an increasing trend over time, whereas they declined over the course of the spring fishery. It is important to note that the maintenance of high catch rates in N-ENS since 2011 is in part a consequence of increasing mean size of crab in the catches rather than just numerical abundance (Figure 52). The N-ENS fishermen feel that their maintenance of high catch rates since 2011 indicates a much larger biomass of commercial crab than is necessarily indicated by survey-driven biomass estimation. They felt the discordant timing of the survey (fall) versus the fishery (spring-focused) causes this discrepancy.

In S-ENS, the 2017 catch rates were 94 kg/trap, a decrease from 2016 rates (106 kg/trap) and below the 15-year mean of 101 kg/trap (Table 3; Figure 4). Catch rates declined from 2016 in each of the two CFAs in S-ENS, CFA 23 and CFA 24. Crab Fishing Area (CFA) 23 has had higher annual catch rates since 2009 but saw a sharper decline than CFA 24 in 2017. Catch rates were uniformly moderate/high throughout the majority of the exploited fishing grounds in S-ENS, with the localized higher catch rates in the deep water holes between Misaine, Banquereau and Middle banks (Figure 50). The lack of very low localized catch rates suggests that fishers were efficiently identifying high abundance locations and, therefore, generally avoiding over-depletion of lower abundance areas. Limitations on access to all fishing grounds caused by temporal exclusions ("shrimp boxes") may lead to short-term localized depletion in available fishing grounds during spring fishing activities. Examination of weekly catch rates over the course of the 2017 season (Figure 51) shows a cyclical pattern in CFA 23 with increasing catch rates over the first 7 weeks of the season followed by a general decreasing trend with a marked resurgence with the opening of the "shrimp boxes" and a declining trend after that time. However, CFA 24 shows a fairly consistent catch rate trend over the course of the season. This would suggest that CFA 23 catch rates are more affected by limited access to fishing grounds caused by seasonal closure of the "shrimp boxes". It is important to note that in all areas it is common to see a strong divergence in catch rate from the season trend during the final weeks of the season. This is assumed to be caused by the almost complete lack of effort and landings during this time. Some catch in traps is not retained on the final trip as individual guotas have been reached.

In 4X, the 2016/2017 catch rates were 25 kg/trap (Table 4; Figure 4), a decrease of 19% from the 2015/2016 catch rate, at the 14-year mean of 26 kg/trap. Catch rates for the current/ongoing season have decreased substantially from the 2016/2017 season and are at the lowest level since 2003. The 4X catch rates are consistently well below those of N-and S-ENS, even for the 2005-2008 low abundance period in N-ENS. Weekly catch rates in 4X (Figure 51) generally show an oscillating pattern over the course of the season. This oscillation is most likely caused by varying amounts of effort as most fishers shift their efforts away from Snow Crab for the lobster fishery in late-November and return to Snow Crab fishing in mid-January. Localized warming and cooling of waters caused by weather patterns (such as extreme temperature events coupled with on- or off-shore wind direction) are believed by many fishers to further exacerbate these fluctuations in catch rates.

# **At-sea-observer Coverage**

In N-ENS, the at-sea-observer coverage was above the target level of 5% of the TAC, at 5.7%. A total of 443 trap hauls were observed (approximately 4.9% of commercial trap hauls). In S-ENS, 5.7% of the TAC was observed (with a target level of 5%). A total of 757 traps (approximately 1.1% of commercial trap hauls) were observed. In 4X, 6.2% of the TAC was observed, relative to a target level of 10%. A total of 425 traps were observed, 6% of commercial trap hauls.

# Newly Matured (CC1 and CC2) and Soft-Shelled Crab

In N-ENS, CC1 and CC2 crab collectively represented approximately 11.5% of the total catch (Table 12; Figure 53), relative to 1.8% in 2016. A shift towards a predominantly spring fishery has lowered the catch of CC1 and CC2 crab as they are less able to climb into traps earlier in the year due to recent molting as well as a very low abundance of animals recruiting to the fishery. Observed CC1 and CC2 crab were caught in the summer fishery in 2017. Higher incidence of soft-shelled crab in the summer fishery has been suggested anecdotally as being a result of localized depletion of stronger, hard-shelled males, and a consequent increased trapability of new-shelled males due to the lack of competition/inhibition. This increased appearance of CC1 and CC2 supports previous year's trawl survey evidence of the very leading edge of a recruitment pulse entering the fishery. There was an increase in the proportion of the CC4 crab in the observed component of the fishery, which further supports the lack of recruitment over the past few seasons. CC5 levels remain negligible.

Extremely low incidence of soft-shell catches (relative to very high levels in 2005-2008) were observed in both the spring and summer fisheries in N-ENS (Figure 54). If one assumes no recaptures and prorates the observed landings to total landings, this amounts to an additional 39 t (approximately 5% of landings) being discarded as soft crab with potentially high handling-associated mortalities. This is an increase from 2016 soft crab incidence (approximately 1%). A continuation of spring fishing efforts, and shorter summer fishing period, will likely help to control the potential total mortality of soft-shell crab in future seasons. This is particularly important to protect any future increase in internal recruitment to the fishery from within the N-ENS crab population.

In S-ENS, the occurrence of CC1 crab remains at low (<1%) levels (Table 13; Figure 53). There was an increase in the proportion of CC2 crab from 3.6% in 2016 to 6.3% in 2017. Observed catches of high soft-shell percentage (>20% by count) were rare throughout S-ENS in 2016. When prorating observed landings to total landings in S-ENS, this amounts to a potential additional mortality of 101 t (1.5% of landings). Voluntary avoidance of areas showing high incidence of soft crab must be adhered to by all members of the fleet if this mitigation is to be effective. Unfortunately, this is not always the case. There is potential miscommunication as quotas are sold through processors and other brokers and fished by individuals that do not own quota personally and, thus, have no long-term stake in this fishery. All individuals involved in every level of the fishery must realize the potential damage caused by handling soft crab.

In 4X for the 2016/17 season, CC1 and CC2 crab collectively represented approximately 18% of the total catch (Table 14, Figure 53). This level is higher than traditionally observed in 4X. The commercial catches are heavily dominated by CC3 and CC4 crab with a combined percent of approximately 80%. An extreme warm-water even in 2013/2013 is hypothesized to have been very detrimental to the Snow Crab population in 4X. Mortality caused by this warming likely continues to influence species composition in 4X. The data from 4X are not directly comparable to ENS as their fishing season is disjunct from that of N- and S-ENS. This fall/winter 4X fishery continues to show negligible levels of soft crab.

# Old Crab (CC5)

The CC5 crab represented a low proportion of the 2016 at-sea-observed catch in both legal and sub-legal size fractions at less than 1% in all areas (Tables 12-14). Similarly low to undetectable proportions of CC5 crab were observed in the trawl surveys (Tables 15-17). Increasing levels of senescent crab (CC5) is anecdotally stated to indicate under-exploitation of the resource. No such increase has been observed in any area on the Scotian Shelf.

### **RESOURCE STATUS**

#### SIZE STRUCTURE

In S-ENS, the presence of small immature male Snow Crab spanning almost all size ranges (30-95 mm CW) observed by the survey suggests that recruitment to the fishery is probable for the next 4 to 5 years and beyond (Figure 55). An almost complete lack of male crabs <20 mm CW in S-ENS could be due to low abundance or low catchability at that small size.

In N-ENS, the distribution of male size crab appears very similar to that of 2016 with few large mature animals. The recruitment gap (between immature and mature male crab) observed in male crab length frequencies since 2013 has finally disappeared. The leading edge of a recruitment pulse is now entering the fishery, albeit at low levels. Internal recruitment to the fishery is expected to continue for the next 4+ years though high suspected natural mortality of Snow Crab in N-ENS could limit this recruitment.

Area 4X shows minimal potential for internal recruitment to the fishery based on size frequency distributions from the trawl survey. Very few commercial Snow Crab were observed in the Snow Crab survey in 4X. Movement is likely an important source of crab in this area and a lack of any commercial fishing effort in the western portion of CFA 24 hold potential benefits for 4X. As always, erratic temperature fields and associated constriction of viable Snow Crab habitat in 4X create strong uncertainties for the future.

The leading edge of a recruitment pulse created substantial increases in the amount of mature female crab in N-ENS in 2016 (Figure 56) and again in 2017. This large-scale maturation of female crab is expected to continue for the next 1-2 years. S-ENS also showed another increase in mature females though at densities lower than those of N-ENS. Though limited numbers of female crab exist in 4X, most have now matured. Being downstream of all other crab areas increases the chance of larval settlement in 4X regardless of a resident population of mature females. It is noteworthy that though mature (egg-bearing) female abundance is at the highest levels in recent years, it exists at lower levels than observed previous to 2009.

Male size frequency distributions in 4X appear to exist in a very erratic state, with less annual consistency as compared to N-ENS and S-ENS. The large temperature fluctuations and the different predator fields associated with the warmer waters in the area, and potential movements with CFA 24, likely result in these unstable size structures. Movement of crab away from traditional locations within 4X, in reaction to such temperature and predation changes, may confound inter-annual survey results.

#### **SEX RATIOS**

When the relative number of mature females is high, the possibility of reproductive limitation becomes a conservation issue. This is particularly the case in heavily exploited areas where there is an absence of large mature males able to mate and protect the more rapidly maturing and smaller females. This is observed in the southern Gulf of St. Lawrence, where male limitation is a known issue. Conversely, with very low relative numbers of females (e.g., the

extended period observed in the early 2000s throughout the SSE) there is low egg and larval production. What may have caused this extended period of poor reproductive potential in the SSE is not known, especially as this fishery is a male-only fishery. A possible explanation for this may arise from differential predation pressures for males and females, as they are spatially segregated in their immature stages and as they are also sexually dimorphic. Irrespective of the specific cause, extreme sex ratios represent an unhealthy reproductive state and, therefore, a long-term conservation issue. Discontinuity between temporal trends of mature male and mature female population peaks may be a driving force behind large scale immigration or emigration patterns.

There is a high likelihood that sex ratios will naturally fluctuate over time (Figure 57). This is because female Snow Crab of a given year-class will mature two to four years earlier than a male from the same year-class. Females are also believed to have a shorter mature and total life span. Such natural oscillations will be particularly evident when strong year-classes dominate a population, as has been the case in the SSE. In the SSE, the sex ratios of mature Snow Crab oscillate with relatively high numbers of females in 1996, 2007 and again in 2017, with a major trough in the early 2000s and again in early 2010s (Figures 57 and 58). Since 2007, sex ratios of S-ENS and N-ENS Snow Crab have declined, although the past two surveys have shown sex ratios higher than the previous 7 years. This increase is reflective of decreasing male population and, to a larger degree, increases in mature females. Area 4X sex ratios of mature crab have increased steadily since 2014, likely due to decreasing abundance of mature male crab.

The sex ratios of immature Snow Crab (Figure 59 and 60) have decreased in all areas since 2016. This is due to female crab of the recent population pulse maturing before the males of the same age cohort, lowering immature sex ratios while increasing mature ratios. The spatial patterns of the sex ratios are generally distinct between offshore and inshore areas: immature males are found in greater proportion (blue) in most areas in ENS, whereas immature females (red) are found in greater proportion in areas bordered by warm water, such as the western portion of CFA 24 and along the eastern and southwest shore of Nova Scotia (Figure 60). When such spatial segregation is observed, the sexes are likely exposed to differential predation effects. Immature females are likely preyed upon by fish and other macro-invertebrates (including other female Snow Crab, other crabs and lobster) favoring warmer water habitats. This pattern would be exacerbated by the sexual dimorphism of Snow Crab, as males grow to be larger and so escape some of the size-dependent predation to which the smaller females would be exposed.

# FEMALE NUMERICAL ABUNDANCE<sup>2</sup>

Trends in the number of immature and mature females caught in the trawl surveys has been variable across areas (Figures 61-64). In N-ENS, the density of immature female crab increased steadily from 2009-2014 and has been declining since. Maturation of these immature crab began in 2015 and continued in 2017, lowering the immature component of the female population (Figure 61), but increasing the mature component (Figure 63). Based on population size structure, increases in mature female abundance are expected for the next 1-2 years as was seen during the 2004-2007 period.

In S-ENS, immature female crab were at historical highs in 2006. Since 2010, there has been a generally decreasing trend in immature female crab (Figure 61). There has, however, been a

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<sup>&</sup>lt;sup>2</sup> Most categories of Snow Crab are likely under-estimated as catchability corrections are not applied. Their intended use is, therefore, solely to compare relative trends over time.

decreasing trend in numbers of mature female Snow Crab in S-ENS from 2008-2015 (Figure 63). As in N-ENS, maturation of a substantial pulse of female crab began to occur in 2016 and is expected to increase mature female crab numbers for 1-2 more years (Figure 56).

Immature females in 4X have declined dramatically since an extreme high in 2010. Immature female crab numbers remain low. The mature fraction of the female abundance increased slightly since 2016 (Figure 63).

Most of the female crab are primarily found in shallower areas along the shore of mainland Nova Scotia and in offshore areas (Figures 62 and 64). For female Snow Crab, immature crab appear to have a more diffuse distribution than mature crab (Figures 62 and 64).

Maturation of immature female crab in N- and S-ENS in 2016 and 2017 has increased potential egg production (Figure 66). Egg production is expected to continue increasing for 2-4 years as more immature animals reach sexual maturity and larger egg clutches in multiparous (vs. primiparous) crab should further bolster egg production.

# FISHABLE COMPONENT OF POPULATION

Trends of geometric mean survey catches of commercial (male, mature >95 mm CW) Snow Crab are shown in Figure 67. The **stmv** generates area biomass estimates through aerial expansion of survey catches (Figure 68). In N-ENS and S-ENS, the highest fishable biomass densities appeared less concentrated in 2017 compared to 2016 (Figure 69). In 4X, the limited remaining pocket of fishable crab is in close proximity to the 4X/S-ENS line (Figure 69).

# RECRUITMENT

Quantitative determination of recruitment levels into the fishable biomass is confounded by a number of factors. These include terminal molt (and the timing offset of molting in spring and the survey in the fall) as well as the inability to age crab and predict absolutely at what age male crab will terminally molt. Based on size-frequency histograms of the male Snow Crab population, moderate internal recruitment to the fishery is expected for the next year in N-ENS and S-ENS (Figures 55 and 70). 4X internal recruitment is expected to be very minimal. Immigration of crab from outside a given area can represent recruitment to its fishery though is unreliable based on its episodic nature.

In terms of size structure (Figure 55) in N-ENS and S-ENS, the presence of small immature male Snow Crab spanning almost all size ranges (30-95 mm CW) observed by the survey also suggests that internal recruitment to the fishery is probable for the next four to five years. The survival of these small animals is essential for the fishery to realize this recruitment. Any mortality (i.e. predation, environmental, disease, etc.) or emigration can impact this recruitment potential.

Area 4X shows minimal potential for internal recruitment to the fishery for the next 2-3 years, based on size frequency distributions from the trawl survey. Movement is likely an important source of crab in this area and a lack of any commercial fishing effort in the western portion of CFA 24 hold potential benefits for 4X. As always, erratic temperature fields in 4X create strong uncertainties for the future.

#### STOCK ASSESSMENT MODEL

The logistic production model shown here is used as a heuristic to couple landings and biomass estimates from the space time modelling described above in order to simplistically describe the productivity of the system and adjust the biomass scaling in relation to the landings (see Appendix 3 for more details). Posterior distributions for K, r, q and process error (bp.sd) were

updated from the prior distributions suggesting the data did inform the model output (Figures 71-76). Estimates of median population growth rate, r, were 0.917 for N-ENS, 0.795 for S-ENS and 0.712 for 4X (Figure 72), whereas the carrying capacity (Figure 74) for S-ENS (68.71 kt) is approximately 10 times higher than for N-ENS (5.651 kt), largely reflecting the differences in area of suitable crab habitat (Figure 20). There were also differences in catchability coefficient (q) for N-ENS and S-ENS with estimates of 0.507 and 0.878 respectively (Figure 75). These differences in q may reflect the relative ability of the survey fishable biomass index to accurately describe the stock biomass. The posterior distributions for process error (bp.sd) are shown in Figure 74 and observation error (bo.sd) is shown in Figure 75.

The median estimates of  $F_{MSY}$  were 0.459 for N-ENS, 0.397 for S-ENS and 0.356 for 4X (Figure 76).

# **FISHABLE BIOMASS**

The modelled post-fishery fishable biomass index of Snow Crab (Figure 77) in N-ENS was estimated to be 3,140 t, relative to 2,794 in 2016. In S-ENS, the post-fishery fishable biomass index was 37,640 t, relative to 40,100 t in 2017. In 4X, the pre-fishery fishable biomass was 120 t, relative to 149 t in 2016/2017. The 4X biomass estimate is generally more uncertain, as it fluctuates more dramatically than other areas probably a result of more extreme temperature fluctuations and potential migration in and out of the area.

#### FISHING MORTALITY

The N-ENS fishing mortality (F) in 2017 has been estimated to have been 0.18 (exploitation rate 0.16), a decrease from 0.33 in 2016; and below the long-term median (Figure 78).

The S-ENS fishing mortality (F) in 2017 has been estimated to have been 0.25 (exploitation rate 0.22), a moderate increase from 0.23 in 2016 and above the long-term median (Figure 78). Localized exploitation rates are likely higher, as not all areas where biomass estimates are provided are fished (e.g., continental slope areas and western, inshore areas of CFA 24) and there are reports of illegal landings in this area.

The 4X fishing mortality (F) in 2016/2017 has been estimated to have been 0.36 (exploitation rate 0.30), a sharp increase from 0.22 in 2015/2016; and above the long-term median (Figure 78). Realized exploitation rates are likely to be higher, since the computed exploitation rates incorporate biomass from throughout the 4X area and not just the fishery grounds.

# **NATURAL MORTALITY**

Wade et al. (2003) suggested that instantaneous mortality rates for southern Gulf of St. Lawrence male Snow Crab >95 mm CW are within the range of 0.26 to 0.48. Natural mortality estimates for mature female crab have been estimated between 0.66 and 0.78 in the northern Gulf of St. Lawrence (Drouineau et al. 2013). For early benthic females stages (i.e., unfished Snow Crab, sex undetermined), instantaneous mortality may be near 1 (Kuhn and Choi 2011). Thus, the magnitude of fishing mortality (of male crab) seems to be generally smaller in magnitude than that of natural mortality and natural mortality seems to be higher for mature females than mature males. Diet studies (Bundy 2004; see also section: Top-down Control (Predation)), suggest that very few natural predators seem to exist for large Snow Crabs (i.e., legal sized) in the SSE. This has been particularly the case since the demise of most large-bodied predatory groundfish from the eastern part of the SSE. Although recent reports suggest an increase in the relative abundance of predators of Snow Crab, these levels remain a small proportion of historic reports (Figures 23-36). This can especially impact recruiting, juvenile and

larval crab and may be a contributing factor in lower densities of immature Snow Crab than observed in 2007-2010.

Other potential mortality factors include: disease (such as BCD which was found to be present in the SSE at low levels since 2008); seals (near Sable Island; although see arguments to the contrary in Ecosystem considerations, above); soft-shell/handling mortality; illegal landings; bycatch in other fisheries (lobster and other crab traps, long-lining, gill-nets, trawling); and activities associated with various other human activities, such as exploration and development of oil and gas reserves and trenching activities associated with sub-sea cable or pipe-line installation.

### THE PRECAUTIONARY APPROACH

In the context of natural resource management, the Precautionary Approach (PA) identifies the importance of care in decision making by taking into account uncertainties and avoiding risky decisions. This is because natural ecosystems are intrinsically complex and unexpected things can and often do happen (e.g., Choi and Patten 2001). Details on the PA and caveats related to its implementation in the form of simplistic "Harvest Control Rules" can be found in Appendix 2.

The primary tools of fishery management are the control of fishing effort and removals. Generally, by reducing catch and effort, stock status and/or ecosystem context is expected to improve. While it is well known that this is not always the case (Appendix 2), its usage in DFO has been formalized into the determination of Reference Points and Harvest Control Rules.

### REFERENCE POINTS AND HARVEST CONTROL RULES

The 4VWX Snow Crab population is not at, nor near, any equilibrium state. As a result, the parameter estimates derived from the logistic model provide at best first order estimates of the true biological reference points (see methods; Figures 71-76).

The operational reference points associated with the 4VWX Snow Crab fishery are as follows:

- Lower Stock Reference (LSR): 25% of estimated carrying capacity.
- Upper Stock Reference (USR): 50% of estimated carrying capacity.
- **Removal Reference (RR):** not to exceed F<sub>MSY</sub> (where F is the fishing mortality of the legal sized mature male population and MSY is the theoretical Maximum Sustainable Yield).
- Target removal reference (TRR): 20% of the fishable biomass (F=0.22). Secondary, contextual indicators are used to alter harvest rates between 10 and 30% of fishable biomass (FB; F=0.11 to F=0.36).

The Harvest Control Rules (Figure 79) are as follows:

- FB > USR: target exploitation rate of 10% to 30% be utilized, based upon contextual information provided by secondary indicators.
- LSR < FB < USR: target exploitation rate of 0% to 20%, based upon contextual information provided by secondary indicators.
- FB < LSR: fishery closure until recovery (at a minimum, until FB > LSR).

From the logistic model output the current estimates of "carrying capacity" for the fishable biomass of Snow Crab is estimated to be {and 95% CI}:

N-ENS: 5.65 {4.04, 7.91} kt

S-ENS: 68.71 {53.26, 89.07} kt

• 4X: 1.82 {1.09, 2.89} kt

The estimates of  $F_{MSY}$  {and 95% CI} were:

N-ENS: 0.459 {0.211, 0.695}

• S-ENS: 0.397 {0.257, 0.598}

• 4X: 0.356 {0.191, 0.551}

Estimates for 4X should be considered highly uncertain, due to the brevity of their data series and uncertain nature of their error distributions.

### **Future Research Priorities Associated with Reference Points**

Many sources of uncertainty/challenges are associated with these reference points and the underlying biological model:

- The fishery projection model is extremely simplistic and focused upon a limited fraction of the total population; intraspecific and interspecific compensatory dynamics are completely ignored. It is a "tactical" model for short-term projections rather than a "strategic" model for biological description and comprehension of longer-term conservation requirements associated with the PA.
- Large changes in carrying capacity have been observed in the area: pre- and post-collapse
  of groundfish precludes an expectation of a single K (carrying capacity) estimate with
  associated reference points.
- Large spatial and temporal variations in recruitment strength preclude simple r-parameter estimation.
- Large spatial and temporal variations in environmental conditions increase uncertainty in abundance indices and preclude any reasonable assumptions of fixed natural mortality/intrinsic rate of increase.
- Strong spatial and temporal variations in predator abundance, especially of pelagic and early (juvenile) benthic life stages of Snow Crab, preclude a simple assumption of fixed natural mortality/intrinsic rate of increase.
- Cannibalism, especially by mature females upon early benthic stages, results in greater dynamical instability and precludes a constant natural mortality/intrinsic rate of increase assumption.
- Anecdotal sources suggest illegal landings might be large and variable over time. This is not accounted for.
- Sampling at different points of annual biological cycles creates variable catchability/bias issues.
- Life cycle is complex.

As a result, the following research priorities exist with regard to formulating more appropriate reference points:

- Describe environmental influence upon biological cycles (molting, mating, and egg production) and integrate into a more biologically reasonable model.
- Refine the fishery model and survey index:

- Incorporate predators and prey to the fishery model.
- o Incorporate growth and variable r, K parameters.
- Identify core spawning and nursery grounds.
- Refine larval production estimates.
- Describe benthic and pelagic movement/connectivity.
- Describe the role of environment/climate and predator-prey interactions upon pelagic and benthic larval survivorship.

The development of **Ibm** (now **stmv**) was an attempt to address some of the above issues. Further effort will be placed towards improving this new direction in stock assessment.

### RECOMMENDATIONS

### **GENERAL REMARKS**

- 1. The capture of soft-shelled crab has been low for the past several seasons. However, it remains an issue requiring continued diligence in the SSE. The timing of fishing efforts can help avoid periods traditionally associated with high captures of soft crab (winter and spring fisheries). In S-ENS, this is not always the case, and timely responses from industry to avoid fishing in areas showing high incidence of soft crab must continue to improve if unnecessary mortality of recruits is to be averted. Since 2010, to encourage rapid avoidance measures, soft-shell maps were implemented as interactive GoogleEarth™ maps that can be found at the ENS Snow Crab website.
- 2. The longevity of the fishable biomass (and, therefore, the stabilization of the fishery) can be improved by fishing solely upon morphometrically mature crab. The arguments for this approach are as follows:
  - a. Fishing mature crab would allow them to mate as the fishing season is generally postmating season (in ENS, but not 4X). This has the important result of reducing Darwinian natural selection for early maturation, which is a long-term hazard for any fishery that harvests mature individuals.
  - b. The capture of immature crab ("pencil claws") reduces the longevity of the fishable biomass directly relative to a mature-only fishery. The time difference is two to three years as immature crab go through a soft- and white-shelled phases that exclude them from the fishery, and so extends the fishable period by this time.
  - c. Specifically targeting mature (male) crabs is a more optimal exploitation strategy (CC3 and CC4 crab) in that the fishable biomass is harvested when "ready and maximized". This is because there is a significant weight increase if immature crab are allowed to grow and mature (an increase of 250-400%; Figure 7).

In the 2017 season, some of the >95 mm CW male crab will still be composed of immature individuals (Figure 55). Indeed, these immature crab will become the largest-sized (and heaviest) individuals in future catches if allowed to grow and reach terminal molt. They will continue to contribute towards reproduction, population-genetic fitness and represent high quality crab for the industry. Harvesting of this component of the catchable biomass is unwise.

3. Anecdotal reports suggest that illegal fishing activities and mis-reporting of catch continues to occur, predominantly in S-ENS. Illegal/unreported landings represent an additional source

of mortality for a population already pressured by external stressors such as increasing temperatures and predation. Such activities de-stabilize the "precautionary approach" to resource management and can negate the sacrifices made by the Snow Crab industry to help ensure the long-term stability of this fishery. This issue could be addressed through open communication, industry pressure on the offending parties and novel approaches to fisheries regulation enforcement, such as forensic accounting and monitoring production of crab processing facilities.

- 4. Continuation of increasing temperature trends could be harmful to the overall health and abundance of Snow Crab on the SSE. This can create direct mortality or forced emigration in the most extreme conditions or ecosystem regime shifts affecting prey availability, predator abundance, biological processes, etc. Any such changes affect Snow Crab's relative role in the ecosystem and would have population level effects.
- 5. The biomass estimation procedure failed to complete in 2014 and 2015. This required a redesign in biomass estimation approach. The introduction of a new ("**Ibm**") approach for the assessment for 2016 (2016 survey; 2017 fishery) provided biomass estimates that were erratically behaved (large inter-annual fluctuations, etc.). The further refinement into the current stmv approach has simplified the model inputs (limiting the number of environmental inputs) and added a level of local temporal smoothing. The authors believe these results to be more reasonable estimations of abundance.

## **SOUTH-EASTERN NOVA SCOTIA (S-ENS)**

The long-term PA adopted by the S-ENS fishers since 2004 appears to have increased stability in commercial biomass levels. This stability is an important consideration given the continued uncertainty in world markets and the more volatile state of global Snow Crab populations.

For many years, a high productivity regime for Snow Crab created a situation where removals from the fishable biomass (both natural and fishery-related) were more than replenished annually. The S-ENS pre-fishery "target" exploitation rates were often higher than post-fishery "realized" exploitation rates. More recently, reduced recruitment and less favorable environmental/ecosystem conditions have seen removals outstrip recruitment to the fishable biomass. The TAC reductions in the past two seasons have not lowered estimates of fishing mortality. In spite of these TAC reductions, the fishable biomass index has continued declining. This requires adopting a more conservative approach to target exploitation rates.

The S-ENS population is considered to be in the "Healthy" zone (FB > USR, Figure 80). Current fishable biomass estimates are below the long-term mean. As recruitment is expected for at least the next three to four years, there remains scope for flexibility. A moderate TAC reduction is recommended.

## **NORTH-EASTERN NOVA SCOTIA (N-ENS)**

High exploitation rates and limited recruitment caused by handling mortality of soft-shelled crab in the past pushed the N-ENS fishable biomass to historic lows. The capture of soft-shelled crab has been nearly eliminated, helping to protect recruitment. The previous assessment's modelling approach provided biomass estimates for N-ENS that fluctuated wildly by year and were higher than previously estimated. This assessment's further refinement in modelling approach has moderated the inter-annual variations to more believable estimates. With this refinement, modelled fishable biomass index estimates are lower than estimated in the past assessment suggesting that the almost 300% increase in TAC in 2017 was overly aggressive.

The N-ENS population is considered to be in the "healthy" zone (FB > USR, Figure 80). Current fishable biomass estimates are below the long-term mean. Recruitment is expected to continue in coming years but past expectations of recruitment in N-ENS have not always materialized, likely due to emigration, high predation or other sources of mortality. A moderate TAC reduction is recommended.

### **AREA 4X**

As Area 4X is the southern-most area of Snow Crab distribution, existing in more "marginal" environments relative to the "prime" areas of S- and N-ENS, an explicitly Precautionary Approach towards this fishery is essential. Further, very low recruitment into the fishable biomass and the large inter-annual temperature variations increases the uncertainty associated with this area. The extreme warm bottom temperature event of 2012/2013 was very detrimental to the Snow Crab populations in 4X. Indeed, they have yet to recover to previous abundance levels. The previous assessment methodology provided fishable biomass index estimates that appear to be unrealistically erratic and, for 4X, overly optimistic based on the current modelling approach as well as fishery performance.

Current assessment methodologies indicate that the stock remains in the "critical" zone (FB < LSR, Figure 80).

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# **TABLES**

Table 1: Snow Crab fishing seasons on the Scotian Shelf in the year 2017.

Area	Season	_
N-ENS	April 15 <sup>th</sup> – May 14 <sup>th</sup> and July 22 <sup>nd</sup> - August 22 <sup>nd</sup>	
S-ENS (CFA 23)	March 28 <sup>th</sup> – August 31 <sup>st</sup>	
S-ENS (CFA 24)	March 28 <sup>th</sup> – August 31 <sup>st</sup>	
4X	November 7 <sup>th</sup> (2017) – March 31 <sup>st</sup> (2018)	

Table 2: Summary of Snow Crab fisheries activity of N-ENS.

Year	Licenses	TAC	Landings	CPUE	Effort
		(t)	(t)	(kg/trap haul)	(x1000 trap hauls)
2003	80	1,493	1,492	77	19.4
2004	79	1,416	1,418	61	23.4
2005	78	566	562	31	18.4
2006	78	487	486	36	13.7
2007	78	244	233	24	9.9
2008	78	244	238	34	7.0
2009	78	576	579	76	7.6
2010	78	576	576	55	10.5
2011	78	534	536	110	4.8
2012	78	603	603	117	5.1
2013	78	783	783	106	7.4
2014	78	783	778	104	7.4
2015	78	620	619	103	6.0
2016	78	286	290	110	2.6
2017	78	825	813	90	9.0

Table 3: Summary of Snow Crab fisheries activity of S-ENS.

Year	Licenses	TAC (t)	Landings (t)	CPUE (kg/trap haul)	Effort (x1000 trap hauls)
2003	145	9,113	8,836	99	89.6
2004	130	8,241	8,022	106	76.0
2005	114	6,353	6,407	110	58.5
2006	114	4,510	4,486	91	49.4
2007	115	4,950	4,942	100	49.3
2008	115	8,316	8,253	96	85.9
2009	116	10,800	10,645	90	118.8
2010	116	13,200	13,150	103	128.3
2011	116	12,120	12,135	106	118.8
2012	116	11,707	11,733	98	120
2013	116	11,311	11,309	104	108.7
2014	116	11,311	11,267	112	100.2
2015	116	11,311	11,292	106	106.5
2016	116	9,614	9,606	106	90.6
2017	116	6730	6,719	94	71.5

Table 4: Summary of Snow Crab fisheries activity of 4X.

Year	Licenses	TAC (t)	Landings (t)	CPUE (kg/trap haul)	Effort (x1000 trap hauls)
2003/04	9	600	289	13	22.8
2004/05	9	600	413	20	20.8
2005/06	9	337.6	306	29	10.8
2006/07	9	337.6	317	28	11.5
2007/08	9	230	220	18	12.1
2008/09	9	230	229	28	8.0
2009/10	9	230	229	36	6.4
2010/11	9	346	345	38	9.0
2011/12	9	346	344	29	11.8
2012/13	9	263	118	13	9.6
2013/14	9	80	79	15	5.1
2014/15	9	80	82	34	1.7
2015/16	9	150	142	31	4.6
2016/17	9	80	80	25	3.2
2017/18 <sup>1</sup>	9	110	32	13	-

Note: <sup>1</sup>As of February 1, 2018. Season still in progress.

Table 5: Snow Crab carapace conditions (CC) and their description. Hardness is measured by a durometer.

Carapace Condition (CC)	Category	Hardness	Description	Age After Terminal Molt (Approximate)
1	New soft	< 68	claws easily bent, carapace soft, brightly coloured, iridescent, no epibionts	0 - 5 months
2	Clean	variable	claws easily bent, carapace soft, brightly coloured, iridescent, some epibionts	5 months – 1 year
3	Intermediate	> 68	carapace hard, dull brown dorsally, yellow-brown ventrally, no iridescence, shell abrasion, epibionts	8 months – 3 years
4	Old	> 68	carapace hard, very dirty, some decay at leg joints, some epibionts	2 - 5 years
5	Very old	variable	carapace soft, very dirty, extensive decay, extensive epibionts	4 - 6 years

Table 6: Spaghetti tagging by year since 2010 (totals since 2004). Rows represent results of all tagged crab within a single year. Average and maximum displacement represents the mean and maximum of the shortest path distance between tag release and recapture locations.

Year	Tags Applied	Tags Returned	Distinct Tags Returned	Average Displacement (km)	Max Displacement (km)	Average Days to Capture	Max Days to Capture	Average km/ month
2010	2,256	159	148	32.86	150.07	408.47	1124	2.45
2011	1,789	107	106	59.89	259.67	541.43	2278	3.37
2012	1,571	148	130	33.73	231.72	397.68	1552	2.58
2013	3,879	348	316	41.07	503.97	597.07	1467	2.27
2014	3,112	252	231	17.91	219.98	608.54	1200	0.9
2015	2,251	138	130	18.81	220.6	373.27	763	1.53
2016	1,581	88	79	22.49	161.59	343.1	469	1.99
2017	1,318	34	32	2.71	9.18	14.25	17	5.79
All Years/ Areas	22,488	1,748	1,627	27.04	504	455	2278	1.81

Table 7: Summary of spaghetti tagging results by area since 2004.

Area	Tags Applied	Distinct Tags Returned	Average Displacement (km)	Average Days to Capture	Average km/month	Number of Fishermen Returning Tags
S-ENS	13,836	749	26.91	387	2.12	83
N-ENS	7,681	792	32.09	550	1.78	69
4X	971	99	8.88	218	1.24	19

Table 8: Predators of Snow Crab in ENS during the 1995-2016 time period. In each period, N stomachs represents the number of stomachs examined, Freq (%) is the percent of stomachs containing Snow Crab as prey, and Weight (%) is the percent of total weight represented by Snow Crab as prey. All predator species with less than 100 stomachs sampled were removed to negate potential sample size bias.

Predator Species	N Stomachs	Freq (%)	Weight (%)
Striped Wolffish	586	1.37	1.49
Halibut	673	1.34	1.18
Smooth Skate	546	0.92	1.49
Ocean Pout	149	0.67	0.65
Longhorn Sculpin	2101	0.38	0.36
Cod	6510	0.37	0.16
Thorny Skate	2789	0.32	0.60
Sea Raven	736	0.27	0.45
Winter Skate	560	0.18	0.10
White Hake	2729	0.07	0.01
American Plaice	8570	0.06	0.06
Haddock	4777	0.06	0.02

Table 9: Prevalence of bitter crab disease (BCD) on the Scotian Shelf. Total crab refers to the number of crab examined. Visible BCD crab represents those suggested to be positive. Infection rate is the proportion of positives and % male is the proportion of BCD (+) crab that are male.

Survey Year	Total Crab	Visible BCD (+) Crab	Infection Rate (%)	% Male (BCD +)
2008	31,315	24	0.077	54
2009	29,168	33	0.113	61
2010	31,197	19	0.061	53
2011	24,852	22	0.089	59
2012	20,355	16	0.079	62
2013	21,715	16	0.074	56
2014	23,512	20	0.085	35
2015	19,749	20	0.101	55
2016	20,694	28	0.135	36
2017	15,453	13	0.084	54

Table 10: Bycatch (kg) estimates of finfish and invertebrates from the ENS Snow Crab fishery. The estimates are extrapolated from at-sea-observed bycatch and at-sea-observed biomass of catch [i.e., estimated biomass of bycatch = observed biomass of bycatch species / (observed landings of Snow Crab / total landings of Snow Crab)]. The Snow Crab fishery is very species-specific as bycatch levels are extrapolated to be approximately 0.026% of Snow Crab landings for the past three years in ENS.

Species	2015	2016	2017	3-Year Total
Rock Crab	19	0	0	19
Cod	187	84	353	624
Jonah Crab	19	854	0	873
Northern Stone Crab	0	670	18	688
Toad Crab	0	84	35	119
Soft Coral	0	0	18	18
Basket Star	0	0	18	18
Sea Urchin	0	33	18	51
Sand Dollars	0	17	0	17
Purple Starfish	0	0	35	35
Sea Cucumbers	19	50	495	564
Whelk	0	17	0	17
Winter Flounder	0	0	35	35
Eelpout	0	0	35	35
Redfish	75	50	247	372
Sea Raven	37	33	0	70
Skate	0	67	18	85
Northern Wolffish	112	17	0	129
Spotted Wolffish	0	0	194	194
Striped Wolffish	149	100	371	620
Total Bycatch	617	2,076	1,890	4,583
Snow Crab Landings	11,911,000	9,896,000	7,532,000	29,339,000

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Table 11: Bycatch (kg) estimates from the 4X Snow Crab fishery. The estimates are extrapolated from atsea-observed bycatch and at-sea-observer coverage, by biomass [i.e., estimated biomass of bycatch = observed biomass of bycatch species / (observed landings of Snow Crab / total landings of Snow Crab)]. Bycatch levels have been at 0.55% of total landings in the past three years. The limited spatial extent of the fishery for the past two seasons has produced lower bycatch levels than the previous two years with a much larger geographical footprint. The 2017 season ongoing so not presented.

Species	2014	2015	2016	3 Year Total
American Lobster	0	98	48	146
Cod	0	0	16	16
Jonah Crab	7	0	16	23
Longhorn Sculpin	0	0	0	0
Lumpfish	0	11	0	11
Northern Stone Crab	438	130	81	649
Deepsea Red Crab	75	0	0	75
Redfish	0	0	0	0
Sea Raven	521	239	0	760
Total Bycatch	1,041	478	161	1,680
Snow Crab Landings	82,000	142,000	80,000	304,000

Table 12: Carapace condition (CC) of crab ≥ 95 mm CW (percent by number) over time for N-ENS from at-sea-observed data.

Year	CC1	CC2	CC3	CC4	CC5
2006	3.87	9.68	71.14	13.67	1.64
2007	44.53	11.17	36.26	7.22	0.82
2008	26.84	4.21	61.33	6.86	0.75
2009	0.23	3.3	92.11	4.35	0.02
2010	1.6	1.56	92.61	3.97	0.25
2011	0	1.9	95.55	2.49	0.07
2012	0	2.99	95.68	1.33	0
2013	0	1.82	73.93	22.52	1.73
2014	0.09	25.65	72.58	1.67	0
2015	0.06	2.89	89.21	7.59	0.25
2016	0	1.26	84.96	13.66	0.11
2017	0.13	9.32	49.23	40.72	0.6

Table 13: Carapace condition (CC) of crab ≥ 95 mm CW (percent by number) over time for S-ENS from at-sea-observed data.

Year	CC1	CC2	CC3	CC4	CC5
2006	6.16	17.85	68.45	7.24	0.3
2007	7.95	15.61	58.48	16.32	1.63
2008	10.12	8.57	67.93	12.34	1.03
2009	8.41	7.4	64.77	16.9	2.52
2010	2.5	9.75	79.53	7.25	0.96
2011	0.57	9.22	85.42	4.71	0.09
2012	0.29	10.16	85.28	4.2	0.07
2013	0.25	2.78	94.14	2.81	0.02
2014	1.08	23.48	69.45	5.82	0.17
2015	0.7	8.68	83.77	6.61	0.24
2016	0.03	3.53	80.2	15.88	0.37
2017	0.02	6.3	78.67	14.75	0.26

Table 14: Carapace condition (CC) of crab  $\geq$  95 mm CW (percent by number) over time for 4X from atsea-observed data. Year refers to the starting year of the season (i.e., 2014/15 season is shown as 2014).

Year	CC1	CC2	CC3	CC4	CC5
2006	0.05	0.5	98.01	1.44	0
2007	0.18	0.09	78.75	20.75	0.23
2008	0.32	0.16	56.98	42.47	0.08
2009	0.04	0.5	98.89	0.57	0
2010	0.25	1.23	54.28	44.17	0.07
2011	0.05	0.17	94.37	5.32	0.1
2012	0	0.8	81.56	17.16	0.48
2013	0	4.95	89.63	5.37	0.05
2014	0	46.99	51.98	1.04	0
2015	0.84	10.03	64.83	24.24	0.05
2016	0.95	15.54	72.3	10.68	0.54

Table 15: Carapace condition (CC) of crab  $\geq$  95 mm CW (percent by number) over time for N-ENS from trawl surveys.

Year	CC1	CC2	CC3	CC4	CC5
2006	0	18.52	15.74	42.59	23.15
2007	0	23.81	67.35	7.48	1.36
2008	0.14	41.77	50.88	7.21	0
2009	3.53	30.59	64	1.88	0
2010	0	39.05	56.67	4.17	0.12
2011	0.11	38.2	56.75	4.94	0
2012	0	16.89	73.91	9.2	0
2013	0.24	51.22	43.4	5.01	0.12
2014	0	14.08	79.31	6.61	0
2015	0	16.53	29.03	53.63	0.81
2016	0	9.47	41.05	48.42	1.05
2017	0	27.17	43.4	27.2	2.31

Table 16: Carapace condition (CC) of crab  $\geq$  95 mm CW (percent by number) over time for S-ENS from trawl surveys. Crude unadjusted proportions.

Year	CC1	CC2	CC3	CC4	CC5
2006	1.15	17.98	61.55	17.56	1.76
2007	1.37	57.88	31.29	8.89	0.57
2008	0.58	15.12	69.83	13.93	0.54
2009	0.17	25.09	66.45	8.01	0.28
2010	0.22	26.29	71.08	2.22	0.2
2011	0.03	18.87	78.32	2.68	0.1
2012	0.03	18.76	77.57	3.41	0.23
2013	0.09	28.24	65.94	5.54	0.19
2014	0.07	12.11	83.87	3.85	0.1
2015	0.69	22.05	66.92	9.13	1.21
2016	0.31	17.84	69.82	11.36	0.66
2017	0.00	30.84	57.8	11.2	0.54

Table 17: Carapace condition (CC) of crab  $\geq$  95 mm CW (percent by number) over time for 4X from trawl surveys. Crude, unadjusted proportions.

Year	CC1	CC2	CC3	CC4	CC5
2006	0	6.94	83.33	8.33	1.39
2007	0	15.79	78.95	5.26	0
2008	0	1.61	90.32	8.06	0
2009	1.06	10.05	83.6	5.29	0
2010	2.88	21.15	71.15	4.81	0
2011	0	11.11	85.19	3.7	0
2012	0	3.7	51.85	40.74	3.7
2013	7.69	15.38	69.23	7.69	0
2014	0	0	94.12	5.88	0
2015	2.44	2.44	63.41	31.71	0
2016	0	19.44	77.78	2.78	0
2017	16.67	0	50	16.7	16.7

# **FIGURES**

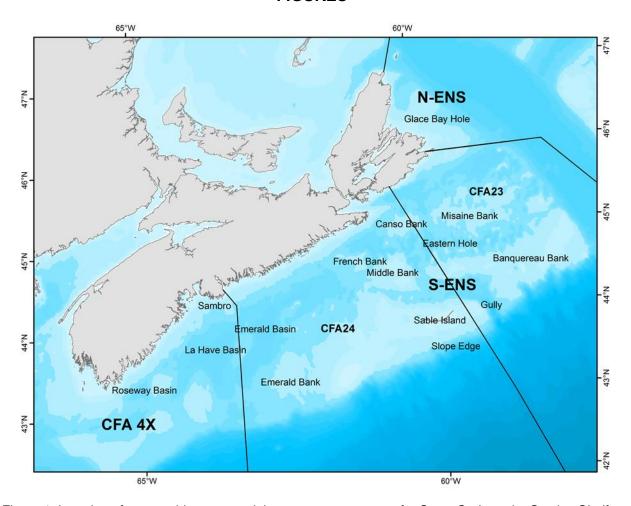


Figure 1. Location of geographic areas and the management areas for Snow Crab on the Scotian Shelf.

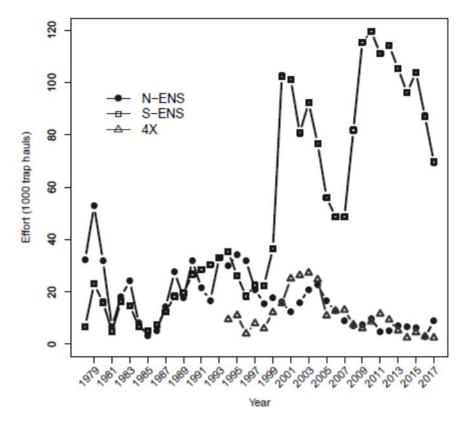


Figure 2. Temporal variations in the fishing effort for Snow Crab on the Scotian Shelf, expressed as the number of trap hauls. Year in 4X refers to the year at the start of the fishing season.

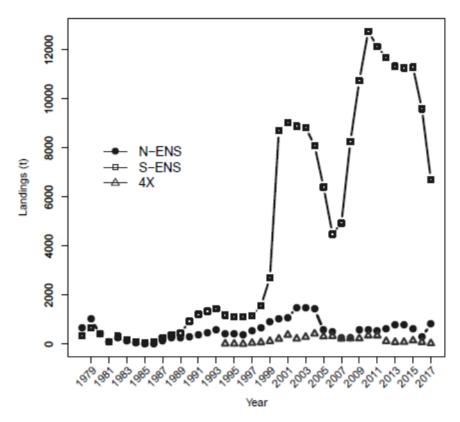


Figure 3. Temporal variations in the landings of Snow Crab on the Scotian Shelf (t). Note the sharp increase in landings associated with dramatic increases to Total Allowable Catches (TACs) and a doubling of fishing effort in the year 2000. The landings follow the TACs with little deviation (Tables 2-4). Year in 4X refers to the year at the start of the fishing season.

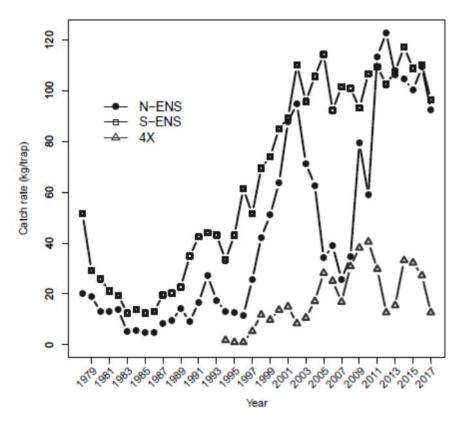
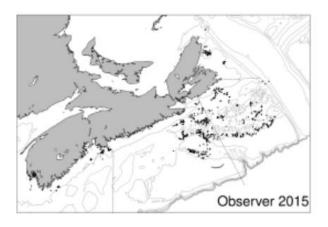
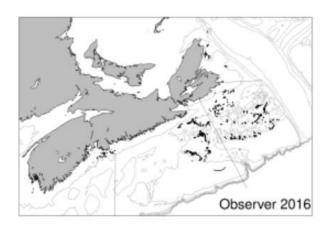


Figure 4. Temporal variations in catch rates of Snow Crab on the Scotian Shelf, expressed as kg per trap haul. Trap design and size have changed over time. No correction for these varying trap-types nor soak time and bait-type has been attempted (see Methods). Year in 4X refers to the year at the start of the fishing season.





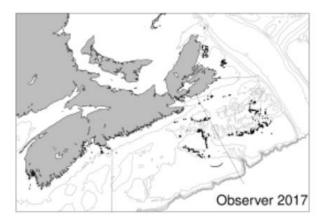
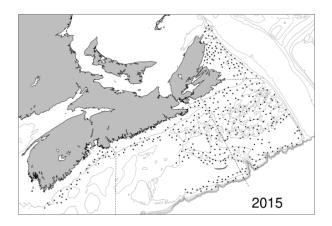
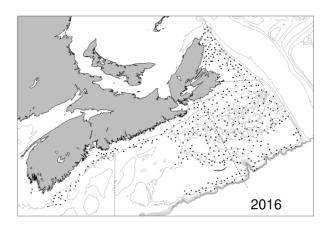


Figure 5. Snow Crab fishing locations monitored by at-sea-observers on the Scotian Shelf during each of the past three fishing seasons.





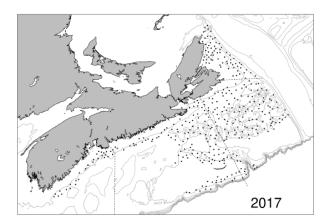
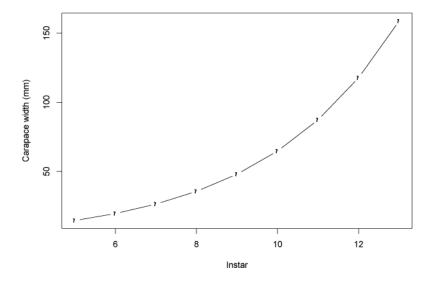


Figure 6. Locations of Snow Crab survey trawl sets on the Scotian Shelf during each of the past three years. Note stations not completed in Southeast corner for 2017 survey as compared to other years.



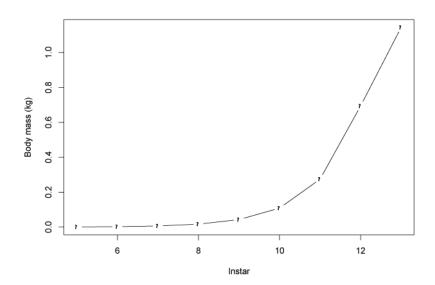


Figure 7. Growth curves determined from modal length frequency analysis of male Snow Crab on the Scotian Shelf.

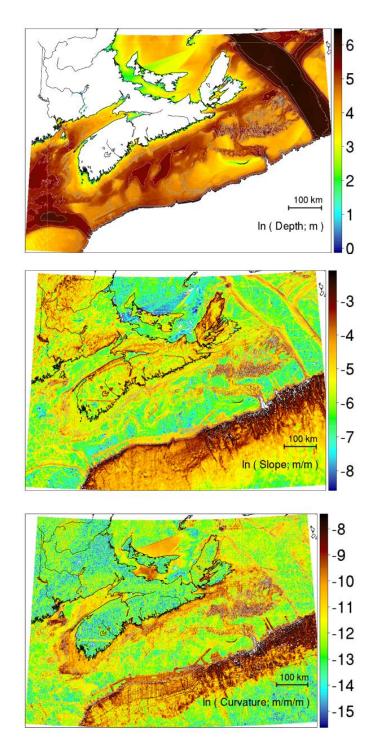


Figure 8. Habitat characteristics used for modeling Snow Crab habitat delineation. The visualizations of temperature variations are for climatological means. Annual temperature variation estimates were used for modeling.

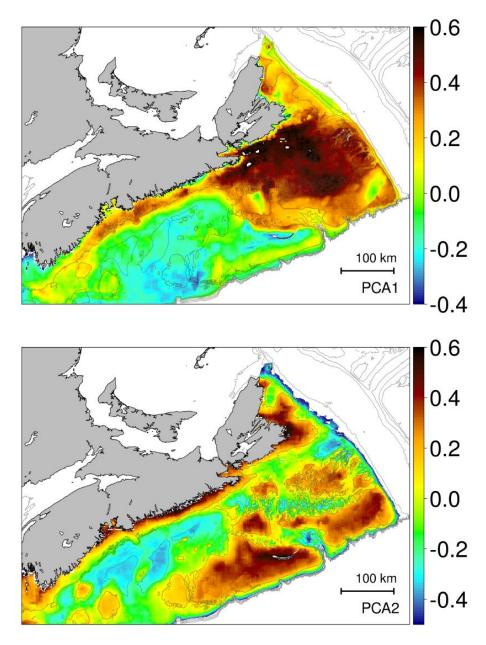


Figure 9. Principal component analysis of species composition (community) characteristics on the Scotian Shelf used in Snow Crab habitat determination modelling. Annual time series are used. Top figure is the first axis or ordination, bottom figure is second axis of ordination.

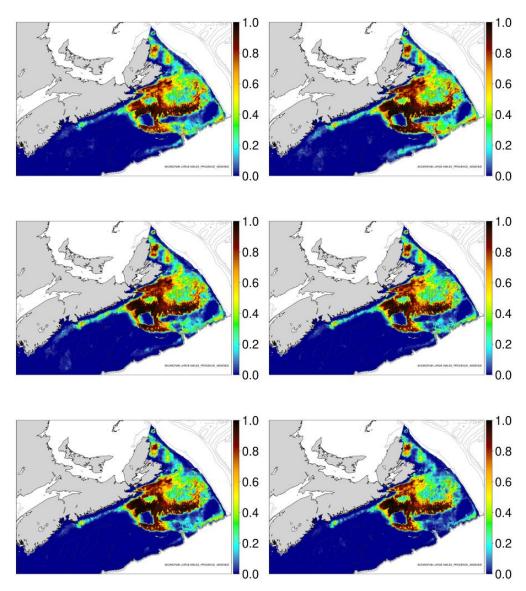


Figure 10. Annual interpolations of potential habitat for the fishable component of SSE Snow Crab represented as the probability of finding Snow Crab. Spatial representations are generated with **stmv** modelling using generalized additive models of several habitat, environmental and biological variables.

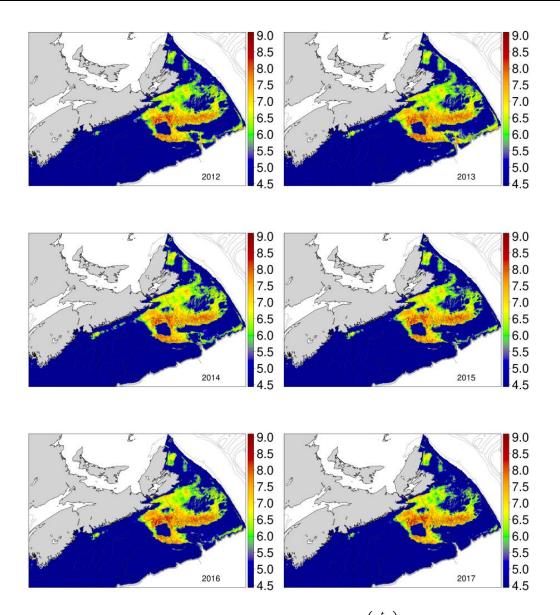


Figure 11. Annual interpolations of fishable Snow Crab biomass  $log\left(\frac{t}{km^2}\right)$ . Spatial representations are generated with **stmv** modelling using generalized additive models of several habitat, environmental and biological variables.

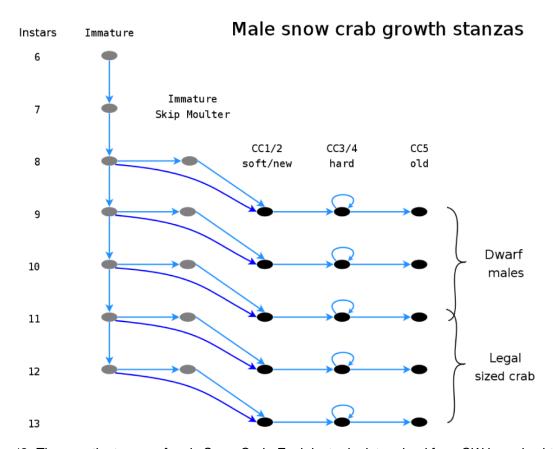


Figure 12. The growth stanzas of male Snow Crab. Each instar is determined from CW bounds obtained from modal analysis and categorized to carapace condition (CC) and maturity from visual inspection and/or maturity equations. Snow Crab are resident in each growth stanza for 1 year, with the exception of CC2 to CC4 which are known from mark-recapture studies to last from 3 to 5 years.

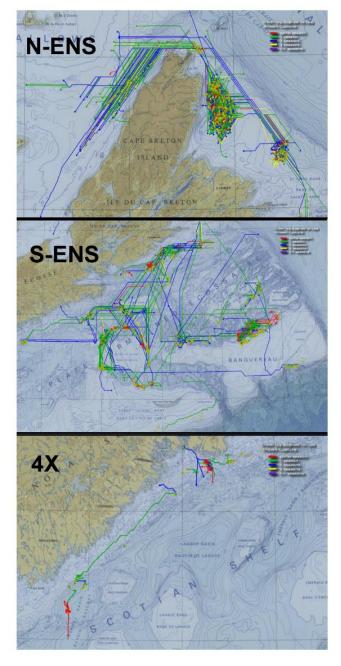


Figure 13. Movement of tagged terminally moulted Snow Crab on the Scotian Shelf. Movement path between release and recapture locations constrained to the shortest path within depth contours of 60 and 280 m. Circles represent release locations and colours represent time interval (in years) between initial tagging and last recapture.

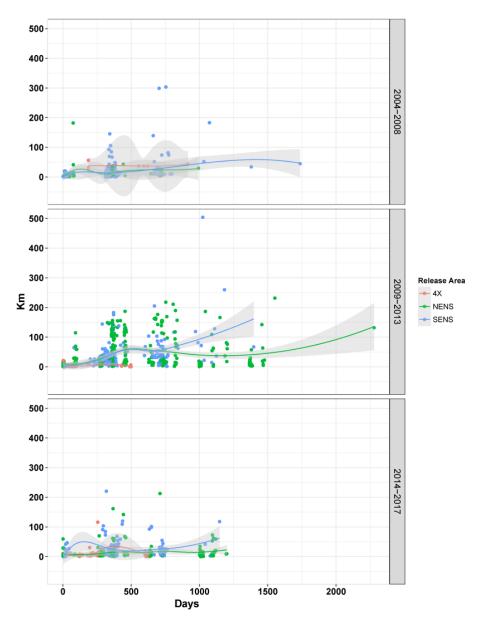
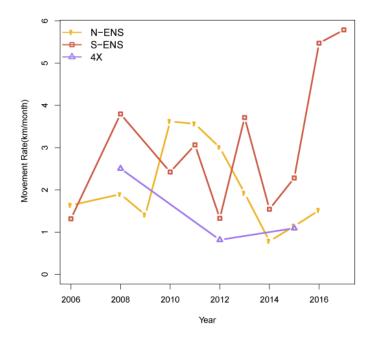


Figure 14. Distance travelled vs. time to capture for tagged Snow Crab on the Scotian Shelf since 2004. Data grouped by release year with release area distinguished by color. Two separate movement patterns observed, most apparent in N-ENS for the 2009-2013 release group. Periodicity in time intervals are explained by recaptures occurring during seasonal fishing operations.



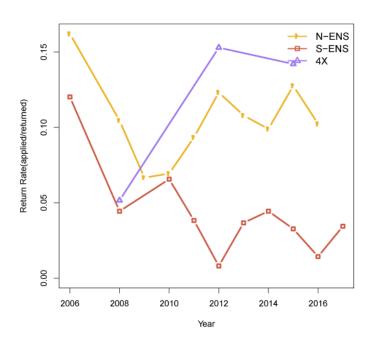


Figure 15. (Top) Mean rate of movement of Snow Crab tagged on the Scotian Shelf by area and year. Route lengths derived from calculated shortest paths constrained by depth range of 60-280 m. Small sample size and short time between mark and potential recapture account for the higher than normal rates for S-ENS in 2016 and 2017. (Bottom) Tag return rate, number of returns from tags applied in given area and year.

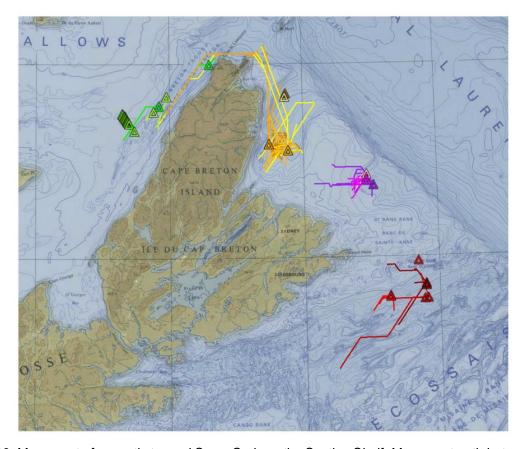


Figure 16. Movement of acoustic tagged Snow Crab on the Scotian Shelf. Movement path between mark and detection locations constrained to the shortest path within depth contours of 60 and 280 m. Triangles represent release locations and individual colours represent individual tagged animals.

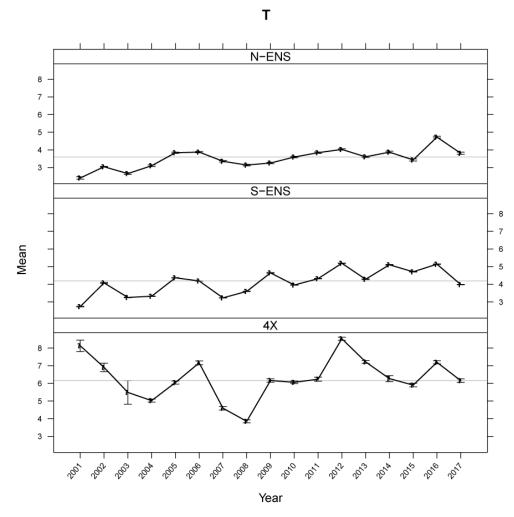


Figure 17. Annual variations in bottom temperature observed during the ENS Snow Crab survey. The horizontal line indicates the long-term median temperature within each subarea. Error bars are 1 standard deviation.

#### **Groundfish Survey Temperature**

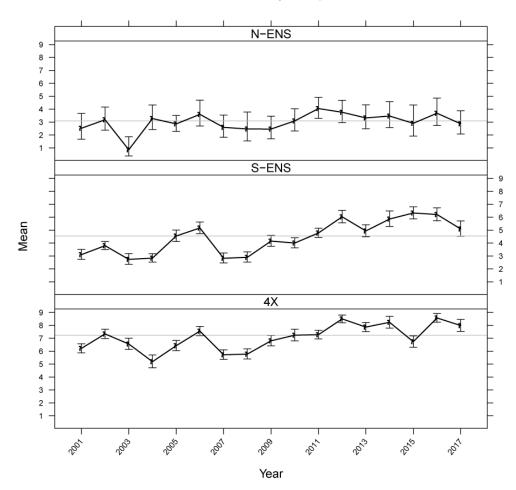


Figure 18. Annual variations in bottom temperature observed during the DFO July RV Groundfish Survey. The horizontal line indicates the long-term median temperature within each subarea. Error bars are 1 standard deviation.

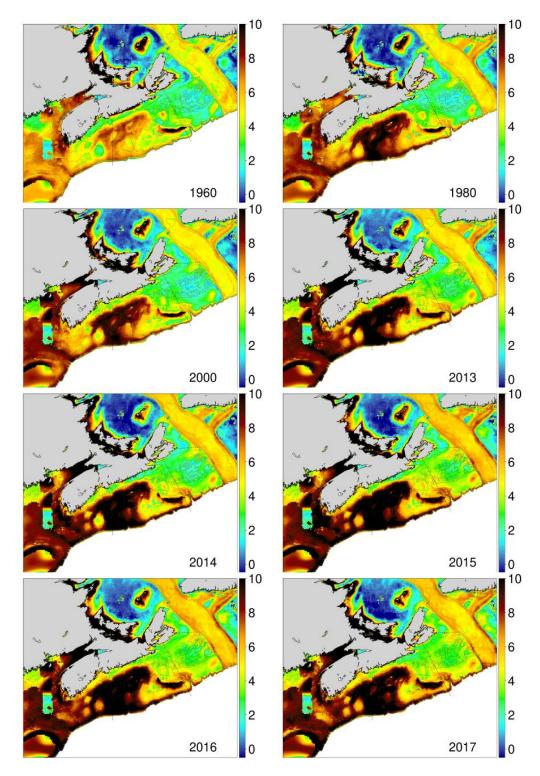


Figure 19. Interpolated mean annual bottom temperatures on the Scotian Shelf for selected years. These interpolations use all available water temperature data collected in the area including Groundfish Surveys, Snow Crab survey, and AZMP monitoring stations.

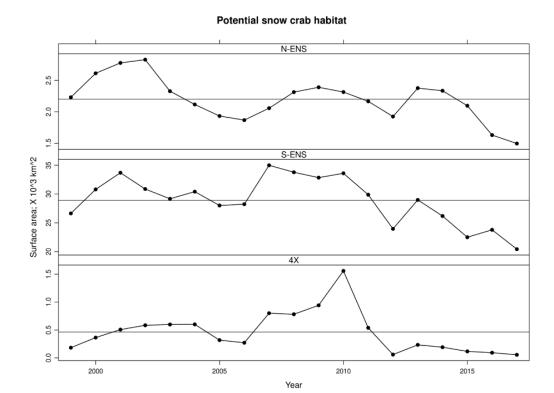


Figure 20. Annual variations in the surface area of potential Snow Crab habitat. The horizontal line indicates the long-term median surface area within each subarea.

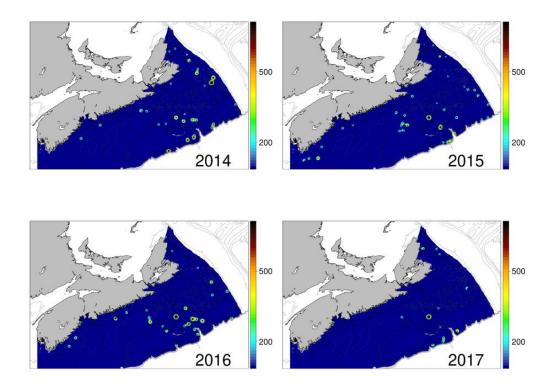


Figure 21. Locations of potential predators of Snow Crab on the Scotian Shelf: **Atlantic Halibut**. Scale is number  $\frac{number}{km^2}$ .

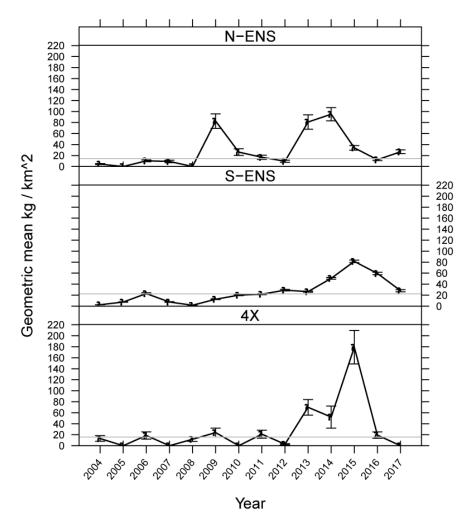


Figure 22. Trends in biomass  $\left(\frac{t}{km^2}\right)$  from the annual Snow Crab survey for potential predators of Snow Crab on the Scotian Shelf: **Atlantic Halibut**.

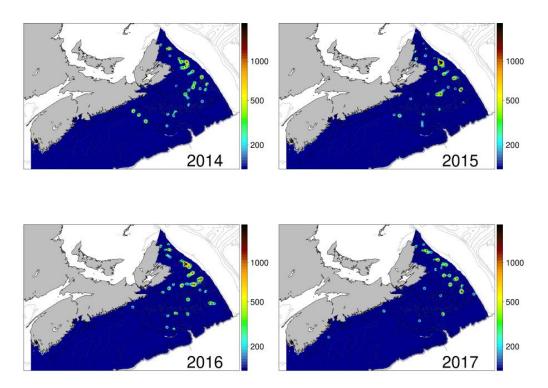


Figure 23. Locations of potential predators of Snow Crab on the Scotian Shelf: **Atlantic Wolffish**. Scale is number  $\frac{number}{km^2}$ .

# **Striped Atlantic Wolffish Biomass**

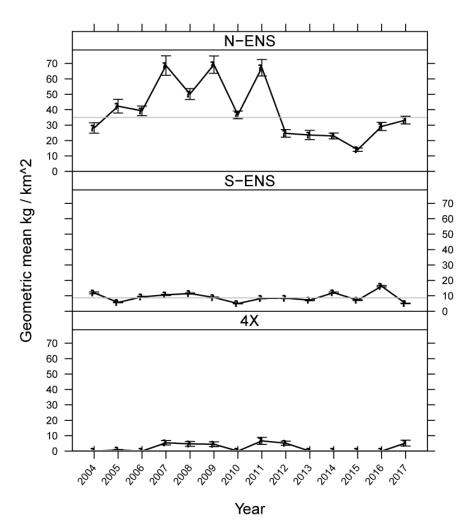


Figure 24. Trends in biomass  $\frac{t}{km^2}$  from the annual Snow Crab survey for potential predators of Snow Crab on the Scotian Shelf: **Atlantic Wolffish**.

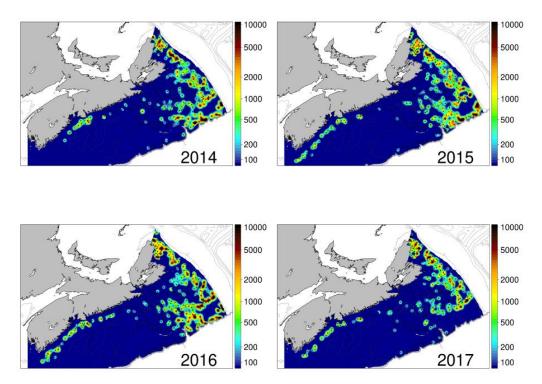


Figure 25. Locations of potential predators of Snow Crab on the Scotian Shelf: **Thorny Skate**. Scale is  $\frac{number}{km^2}$ 

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## **Thorny Skate Biomass**

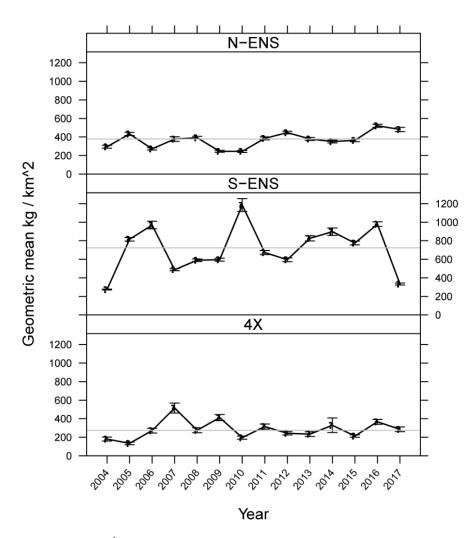


Figure 26. Trends in biomass  $\frac{t}{km^2}$  from the annual Snow Crab survey for potential predators of Snow Crab on the Scotian Shelf: **Thorny Skate**.

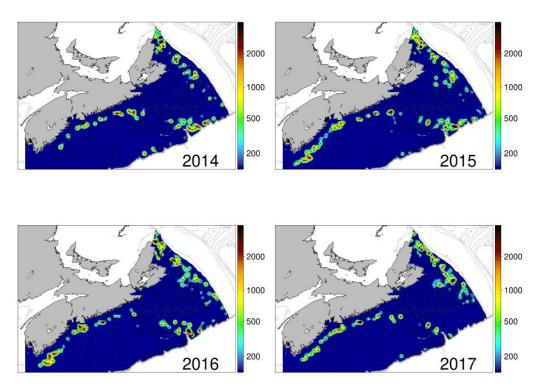


Figure 27. Locations of potential predators of Snow Crab on the Scotian Shelf: **Smooth Skate**. Scale is  $\frac{number}{km^2}$ .

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#### **Smooth Skate Biomass**

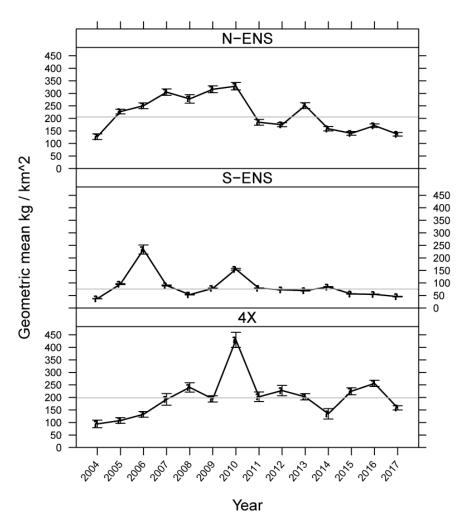


Figure 28. Trends in biomass  $\frac{t}{km^2}$  from the annual Snow Crab survey for potential predators of Snow Crab on the Scotian Shelf: **Smooth Skate**.

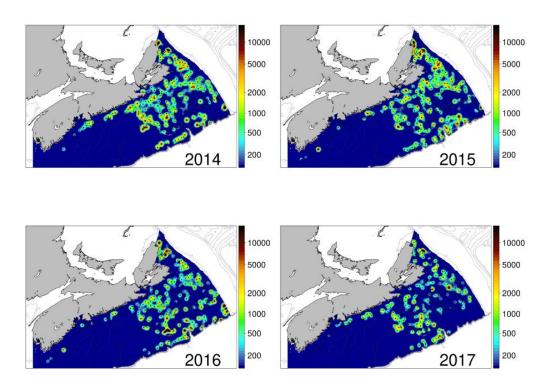


Figure 29. Locations of potential predators of Snow Crab on the Scotian Shelf: **Atlantic Cod**. Scale is  $\frac{number}{km^2}$ .

# Cod(atlantic) Biomass

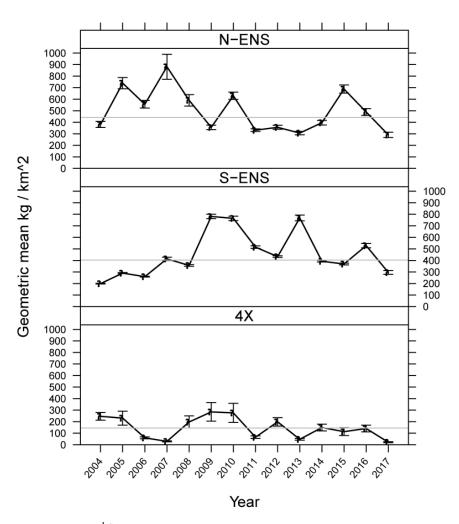


Figure 30. Trends in biomass  $\frac{kg}{km^2}$  from the annual Snow Crab survey for potential predators of Snow Crab on the Scotian Shelf: **Atlantic Cod**.

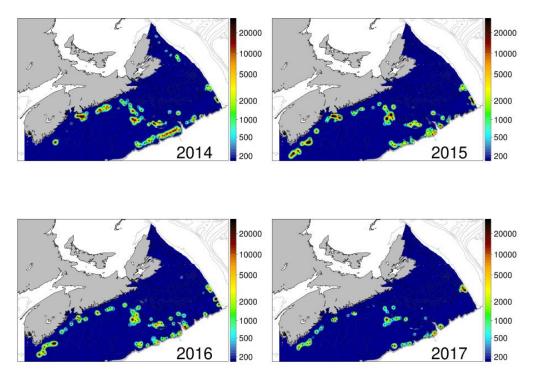


Figure 31. Locations of potential predators of Snow Crab on the Scotian Shelf: **Haddock**. Scale is  $\frac{number}{km^2}$ .

## **Haddock Biomass**

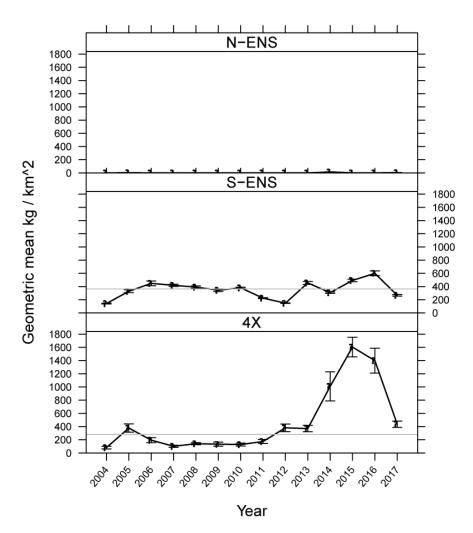


Figure 32. Trends in biomass  $\frac{kg}{km^2}$  from the annual Snow Crab survey for potential predators of Snow Crab on the Scotian Shelf: **Haddock**.

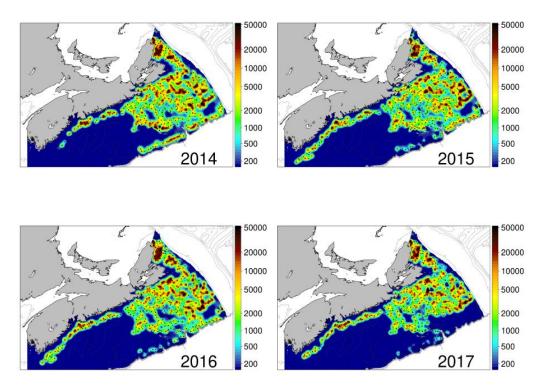


Figure 33. Locations of potential predators of Snow Crab on the Scotian Shelf: **American Plaice**. Scale is  $\frac{number}{km^2}$ .

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## **American Plaice Biomass**

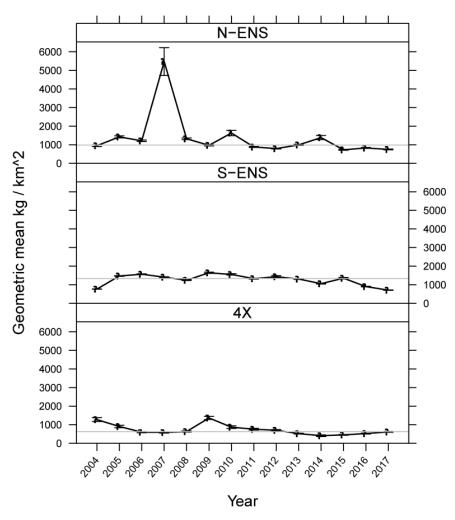


Figure 34. Trends in biomass  $\frac{kg}{km^2}$  from the annual Snow Crab survey for potential predators of Snow Crab on the Scotian Shelf: **American Plaice**.

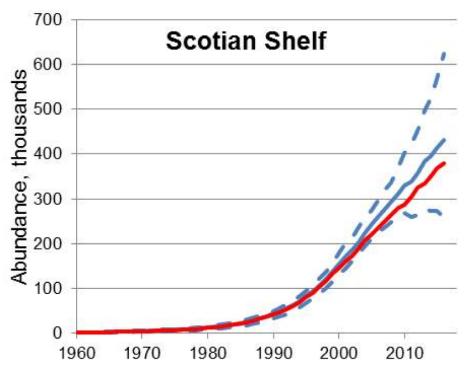


Figure 35. Trends in numerical adundance of Northwest Atlantic Grey Seals. Blue line is 1:1 male:female ratio, red line is 0.69:1. Source: DFO 2017a.

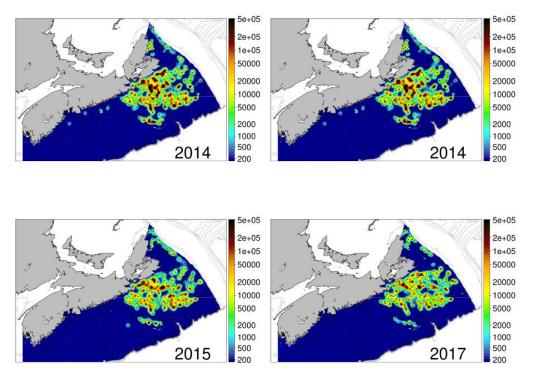


Figure 36. Locations of potential prey of Snow Crab on the Scotian Shelf: **Northern Shrimp**. Scale is  $\frac{number}{km^2}$ .

#### **Pandalus Borealis Biomass**

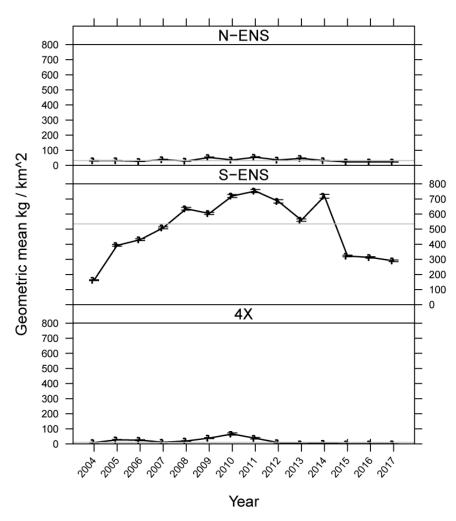


Figure 37. Trends in biomass  $\frac{kg}{km^2}$  from the annual Snow Crab survey for potential prey of Snow Crab on the Scotian Shelf: **Northern Shrimp**.

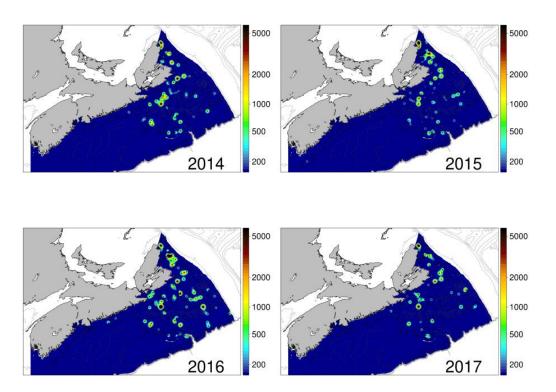


Figure 38. Locations of potential competition of Snow Crab on the Scotian Shelf: Lesser Toad Crab. Scale is  $\frac{number}{km^2}$ .

# **Hyas Coarctatus Biomass**

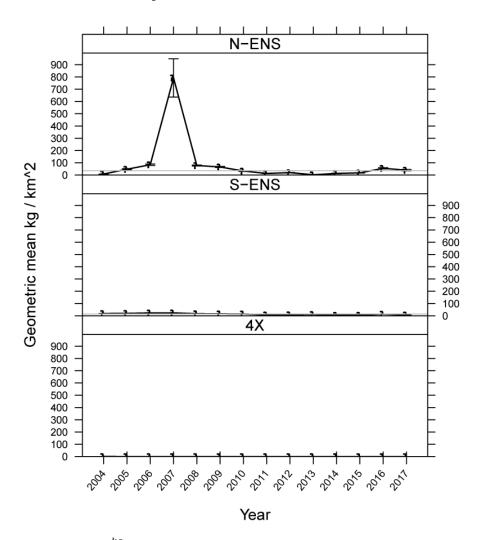


Figure 39. Trends in biomass  $\frac{kg}{km^2}$  from the annual Snow Crab survey for potential competition of Snow Crab on the Scotian Shelf: **Lesser Toad Crab**.

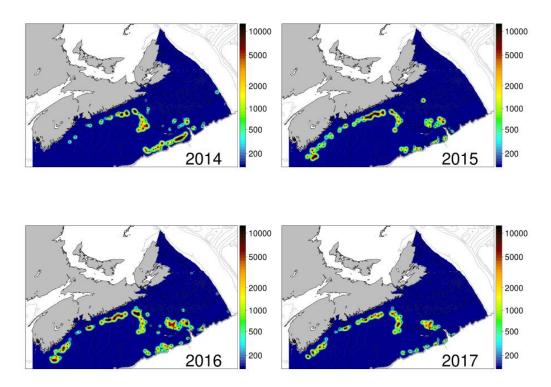


Figure 40. Locations of potential competition of Snow Crab on the Scotian Shelf: **Jonah Crab**. Scale is  $\frac{number}{km^2}$ .

## **Jonah Crab Biomass**

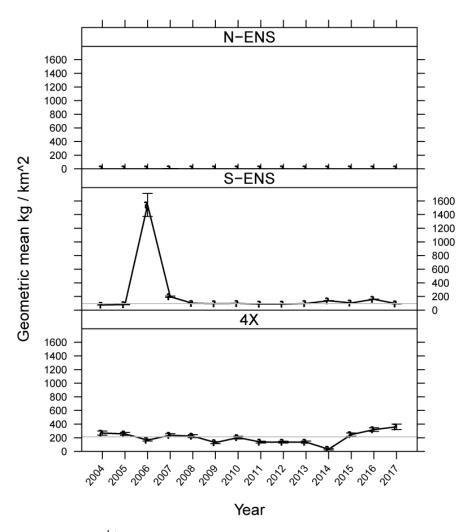


Figure 41. Trends in biomass  $\frac{kg}{km^2}$  from the annual Snow Crab survey for potential competition of Snow Crab on the Scotian Shelf: **Jonah Crab**.

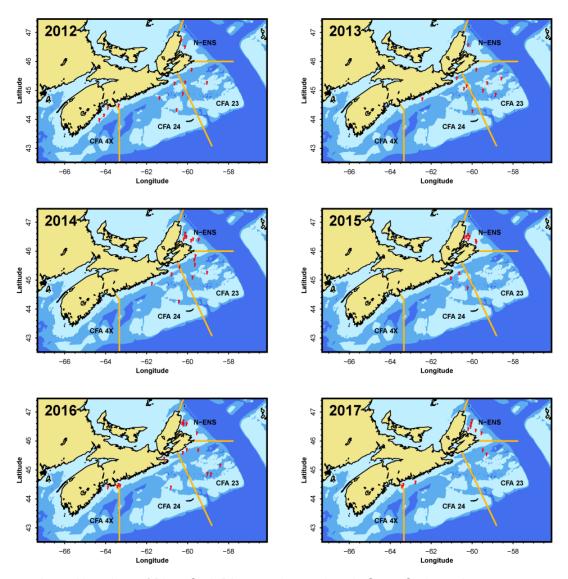


Figure 42. Annual locations of Bitter Crab Disease observations in Snow Crab trawl survey.

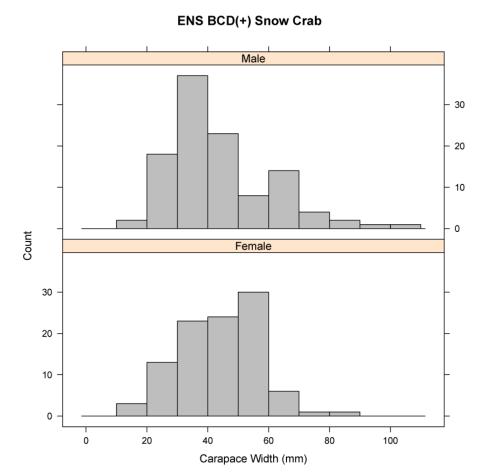


Figure 43. Size frequency distribution of Snow Crab visibly infected with Bitter Crab Disease from 2009-present.

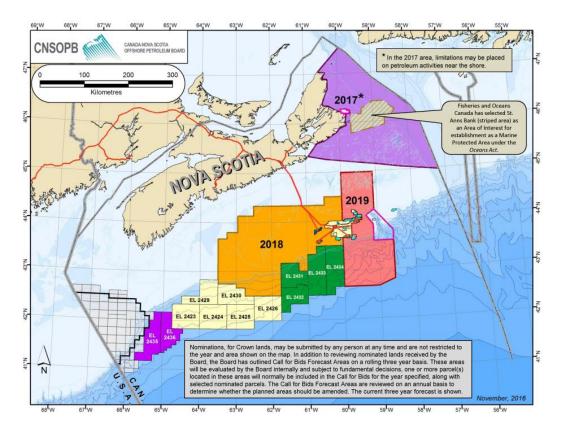


Figure 44. Map of current Canadian Nova Scotia Offshore Petroleum Board call for exploration bids.

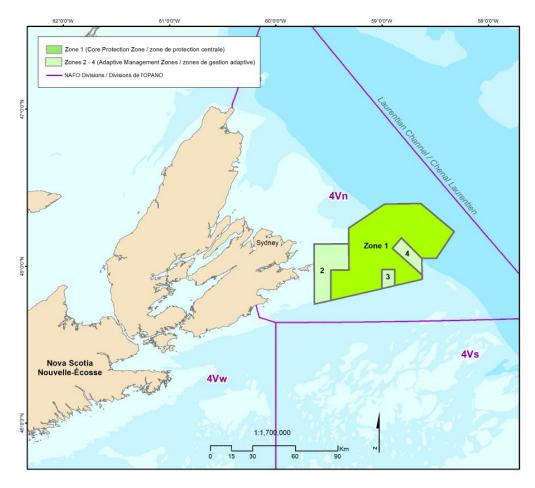


Figure 45. St. Anns Bank Marine Protected Area (MPA) with sub-zone designations. This area received official MPA designation in 2017.

# **Spring Landings**

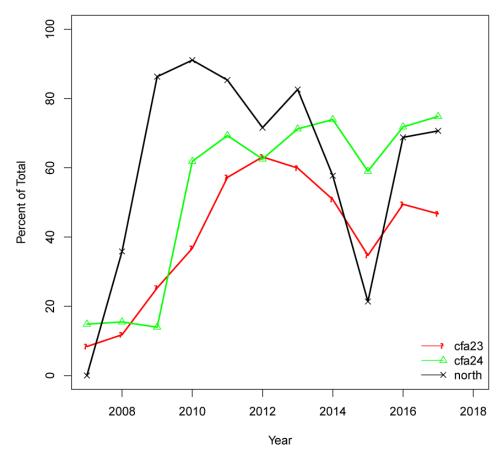


Figure 46. The percent of total annual Snow Crab landings caught during the months of April-June separated by Crab Fishing Area (CFA).

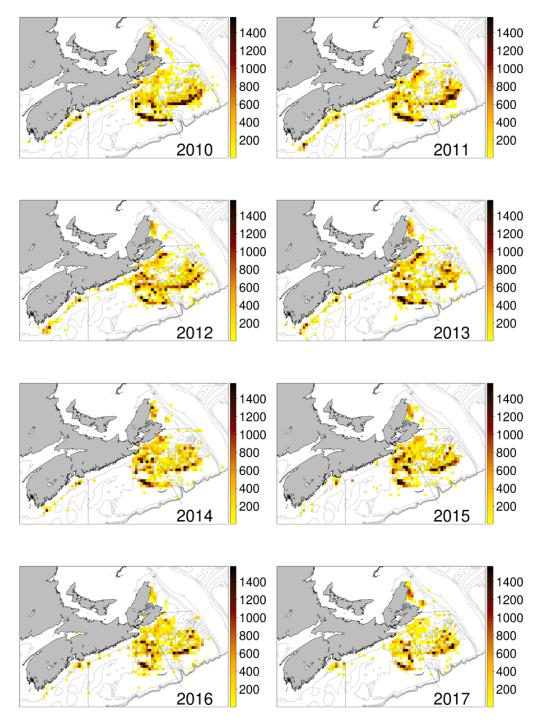


Figure 47. Fishing effort (number of trap hauls/10 x 10 km grid) from fisheries logbook data. Note the increase in effort inshore in S-ENS and the almost complete lack of fishing activity in the Glace Bay Hole area (offshore) of N-ENS. For 4X, year refers to the starting year.

#### Vessels Active by Year

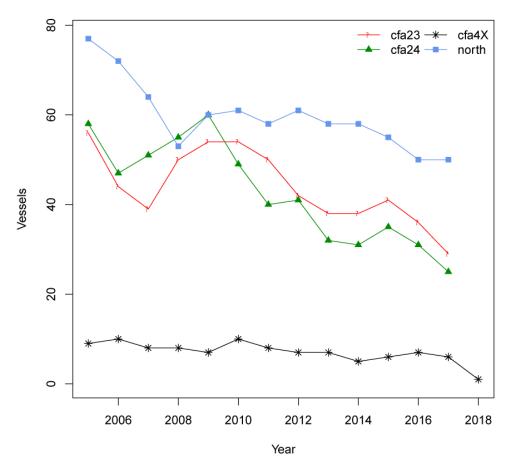


Figure 48. Number of active vessels fishing in each of the SSE snow crab fishing areas. S-ENS is separated into CFA 23 and CFA 24 to maintain consistency with historic information. The number of licences within each area has been stable since 2004.

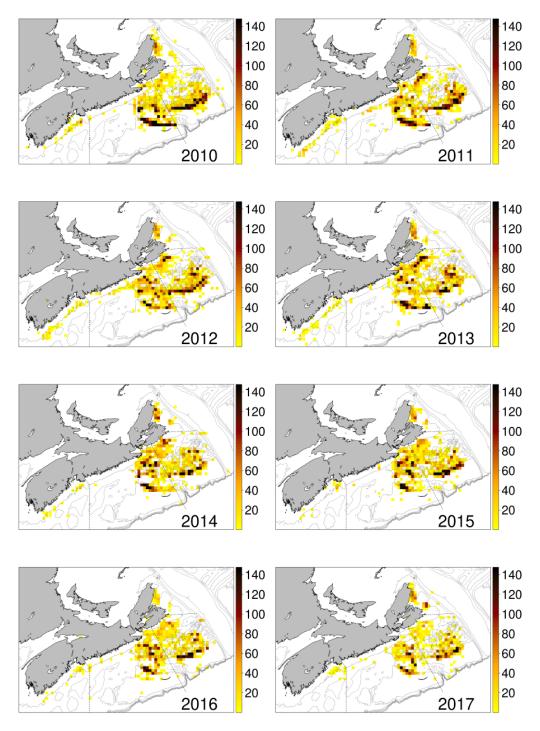


Figure 49. Snow Crab landings (tons/10 x 10 km grid) from fisheries logbook data. For 4X, year refers to the starting year.

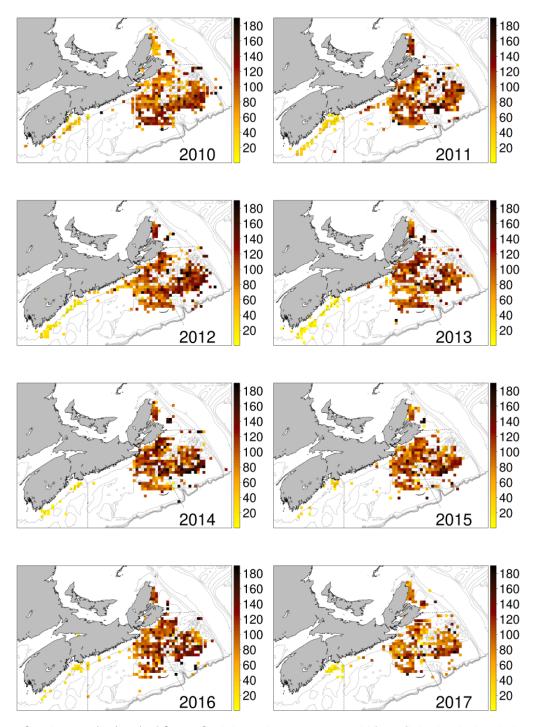


Figure 50. Catch rates (kg/trap) of Snow Crab in each  $10 \times 10$  km grid from fisheries logbook data. For 4X, year refers to the starting year.

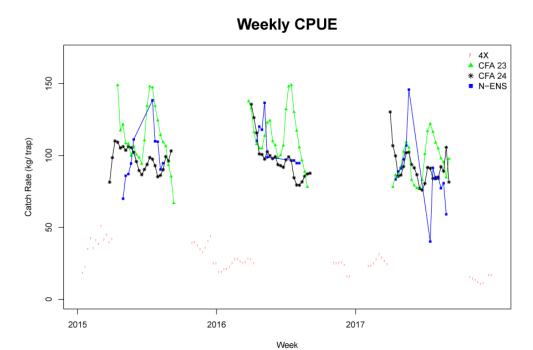


Figure 51. Smoothed catch rates (kg/trap haul) by week for the past three seasons. Split season in N-ENS (spring and summer portions) create the apparent gap in N-ENS data within each year.

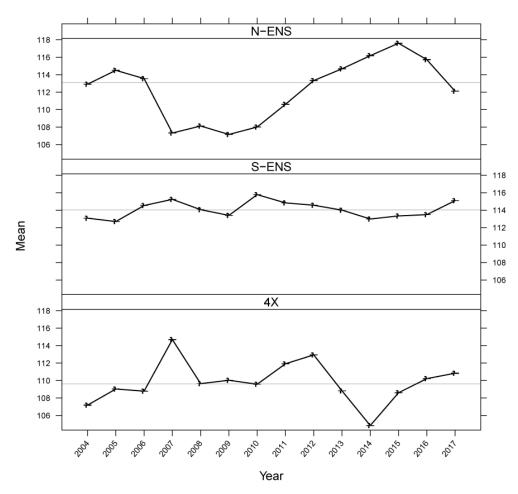


Figure 52. Time series of mean carapace width of commercial crab measured by at-sea observers. For 4X, the year refers to the starting year of the season.

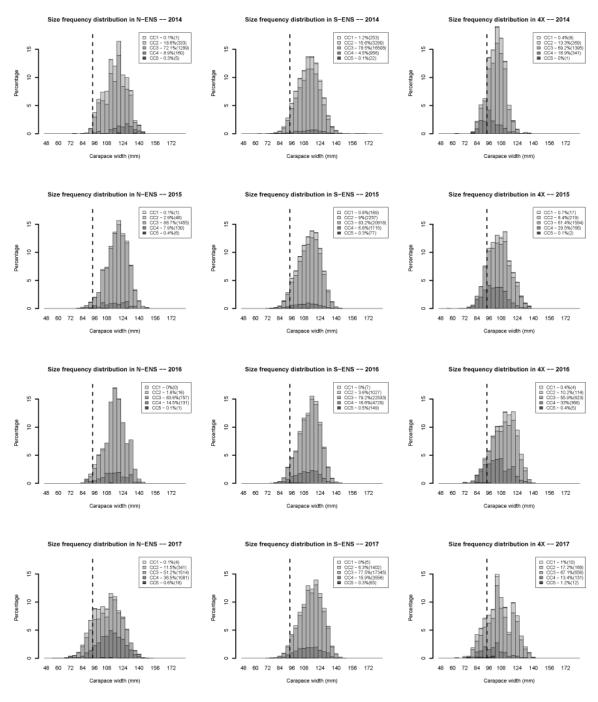


Figure 53. Size frequency distribution of all at-sea observer monitored Snow Crab broken down by carapace condition. For 4X, the year refers to the end year of the season. Vertical lines indicate 95 mm Carapace Width (CW).

# Percent Soft Shell by Month

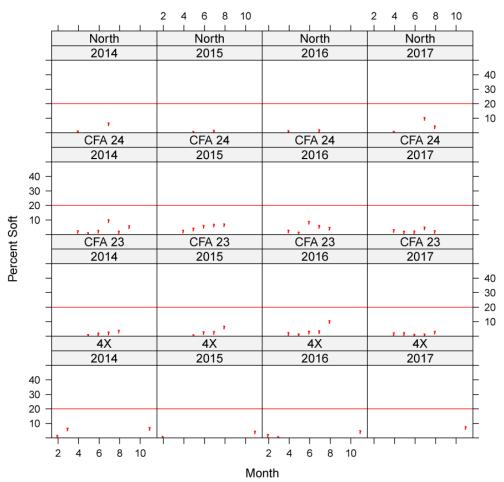


Figure 54. The percent of sampled Snow Crab in the soft shelled state (less than 68 durometer) as determined by at-sea observers from commercial Snow Ccrab traps.

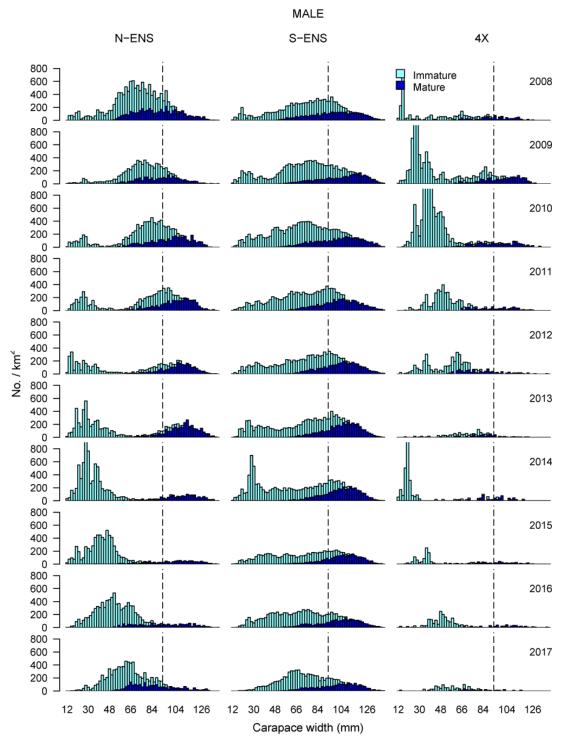


Figure 55. Size-frequency histograms of carapace width of male Snow Crabs obtained from the Snow Crab survey.

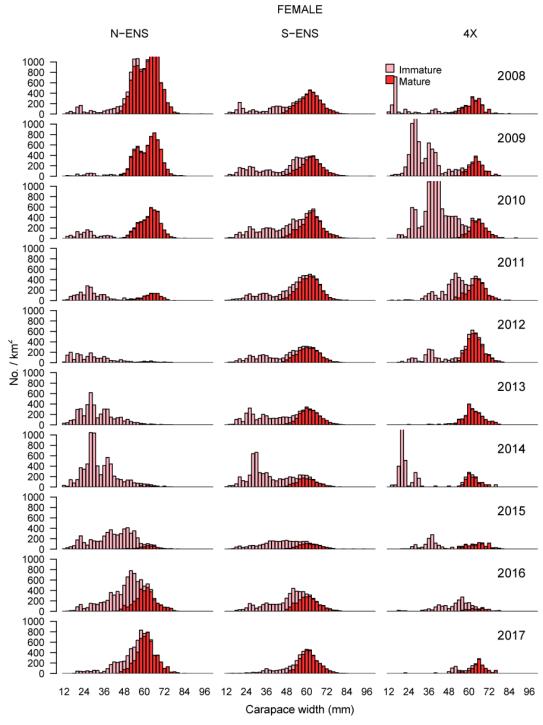


Figure 56. Size-frequency histograms of carapace width of female Snow Crabs obtained from the Snow Crab survey.

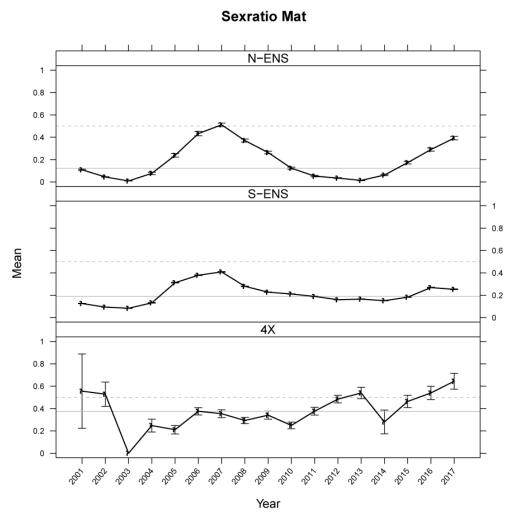


Figure 57. Annual proportion female of mature Snow Crab observed in the survey. Since 2001, most of the Scotian Shelf was uniformly male dominated. One standard error bar is presented.

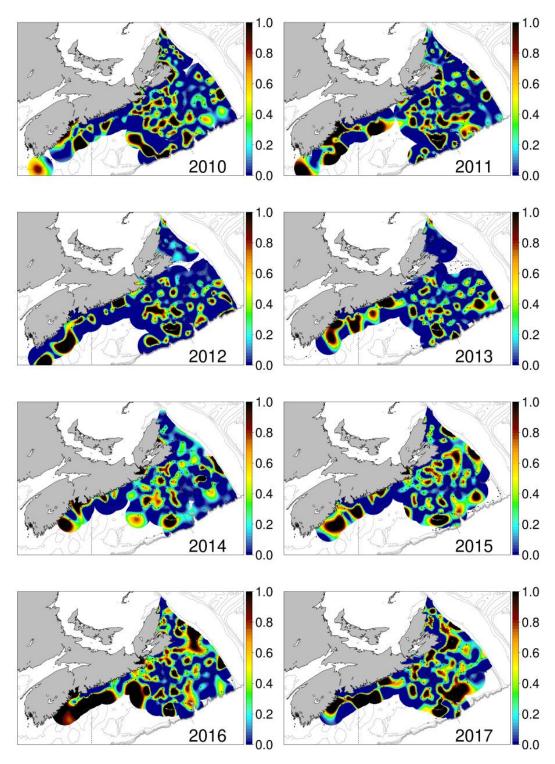


Figure 58. Proportion of females in the mature fraction of the total morphometrically mature segment of Snow Crabs on the Scotian Shelf with spatial representations generated using thin plate spline interpolations of data from the annual Snow Crab survey.

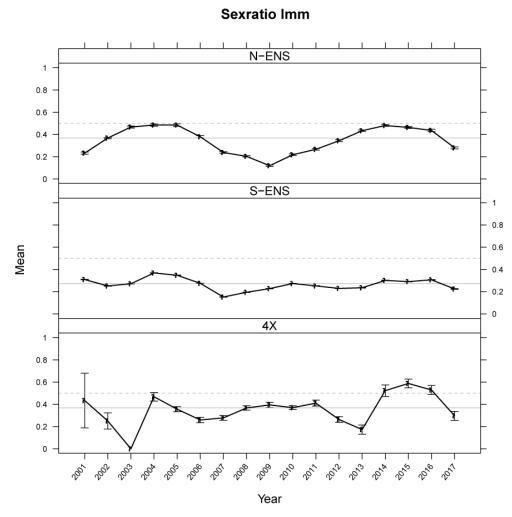


Figure 59. Annual sex ratios (proportion female) of immature Snow Crab on the Scotian Shelf.

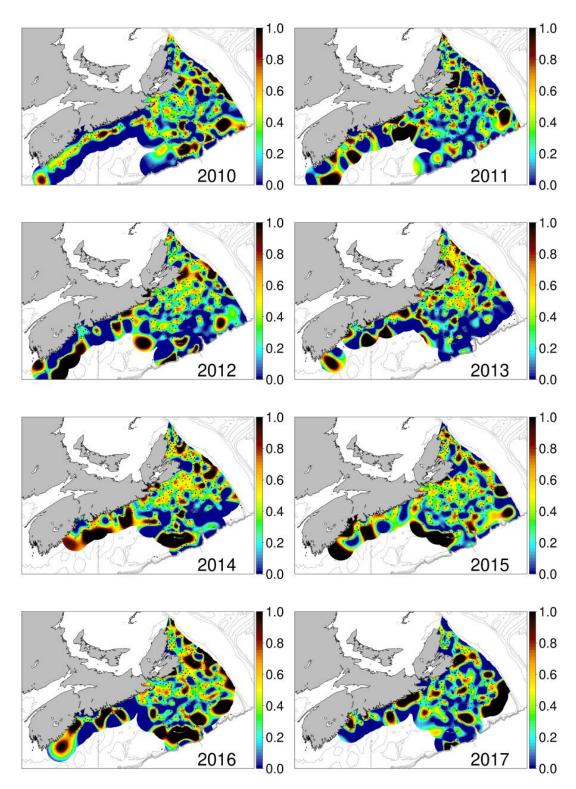


Figure 60. Morphometrically immature sex ratios (proportion of females in the mature fraction of the total numbers) of Snow Crabs on the Scotian Shelf with spatial representations generated using thin plate spline interpolations of data from the annual Snow Crab survey.

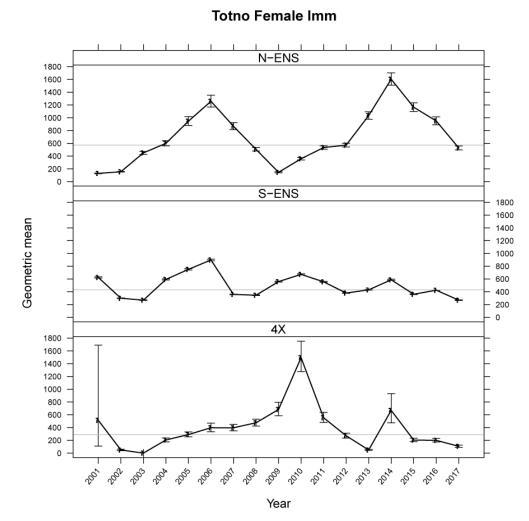


Figure 61. Numeric density of immature females in the SSE.

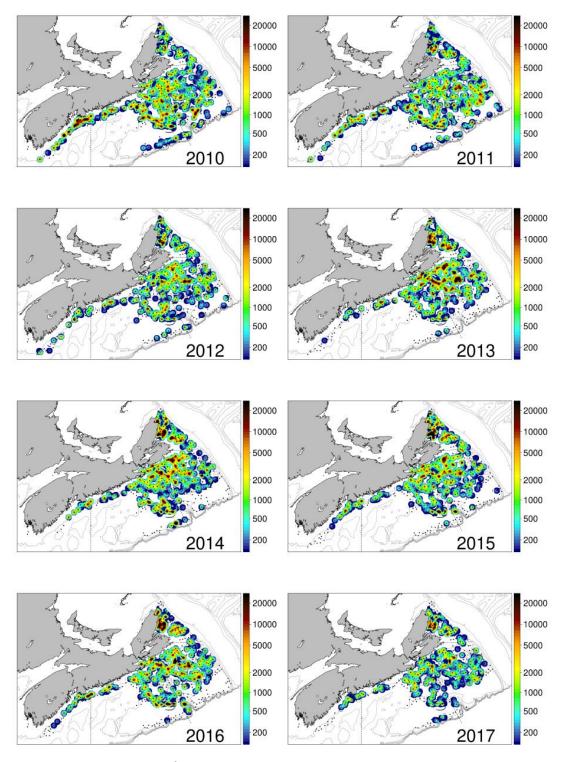


Figure 62. Numerical densities  $\frac{number}{km^2}$  of the immature female Snow Crabs on the Scotian Shelf with spatial representation generated using using thin plate spline interpolations of data from the annual Snow Crab survey.

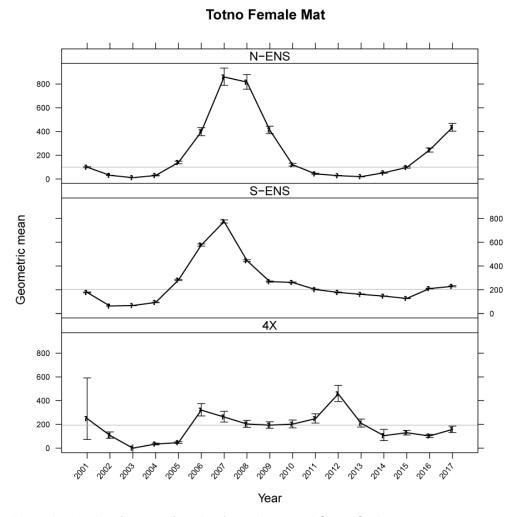


Figure 63. Numeric density of mature females from the annual Snow Crab survey.

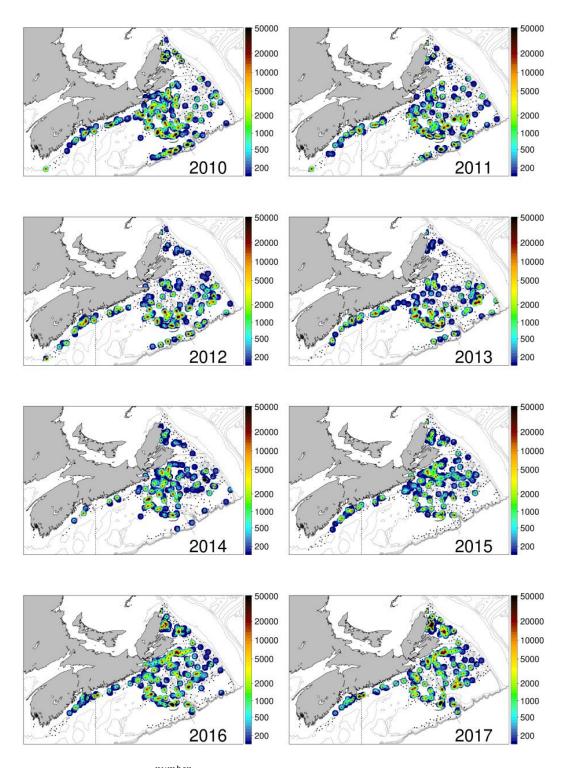


Figure 64. Numerical densities  $\frac{number}{km^2}$  of the mature female Snow Crabs on the Scotian Shelf with spatial representation generated using thin plate spline interpolations of data from the annual Snow Crab survey.

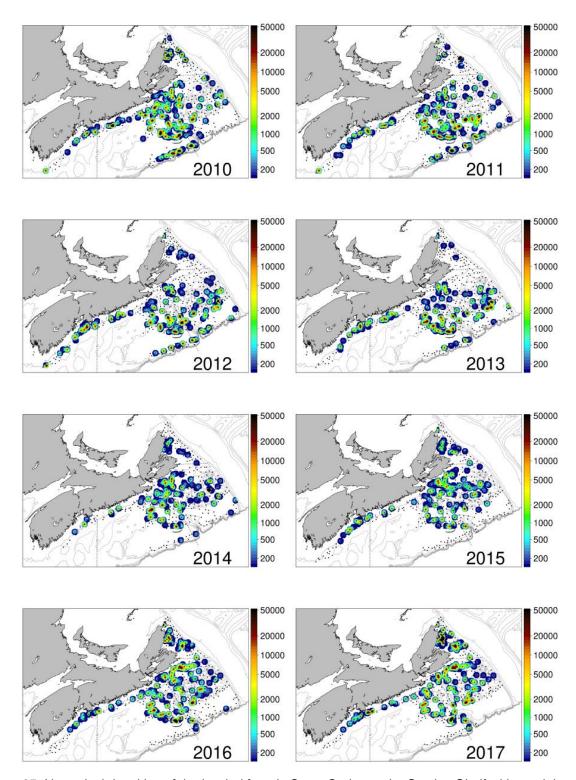


Figure 65. Numerical densities of the berried female Snow Crabs on the Scotian Shelf with spatial representation generated using thin plate spline interpolations of data from the annual Snow Crab survey.

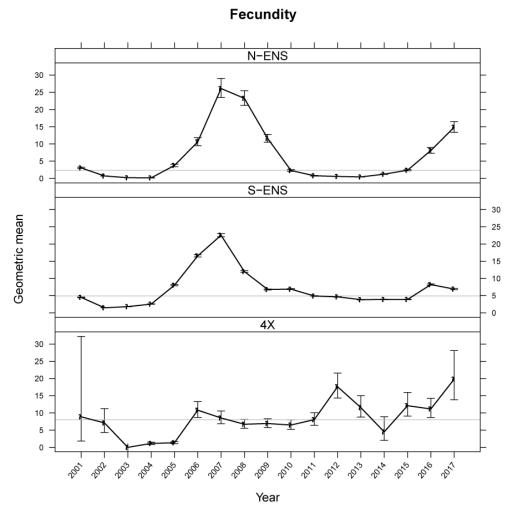


Figure 66. Index of egg production in the SSE, determined from the number of berried females and fecundity at weight estimates.

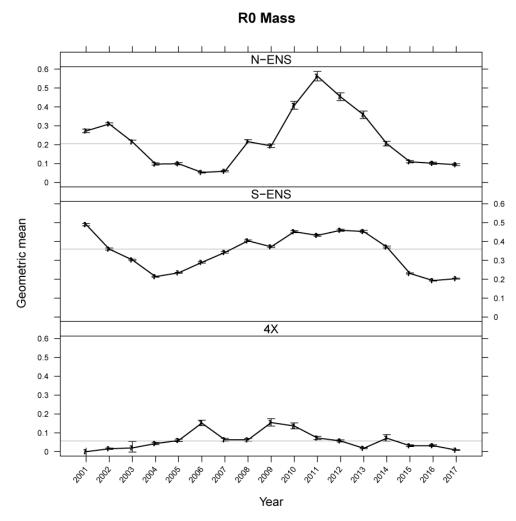


Figure 67. Trends in the geometric mean of fishable biomass  $\frac{t}{km^2}$  obtained from the annual Snow Crab survey. Error bars are 95% Cl about geometric mean.

# Fishable biomass N-ENS N-ENS 4X 2000 2000 2005 2010 2015

Figure 68. Trends in the area expanded geometric mean fishable biomass obtained from the annual Snow Crab survey. Error bars are 95% Cl about geometric mean. Area estimates are obtained from **stmv**. Vertical dashed line represents timing shift from a spring survey to a fall survey. Horizontal dashed line is mean.

Survey year

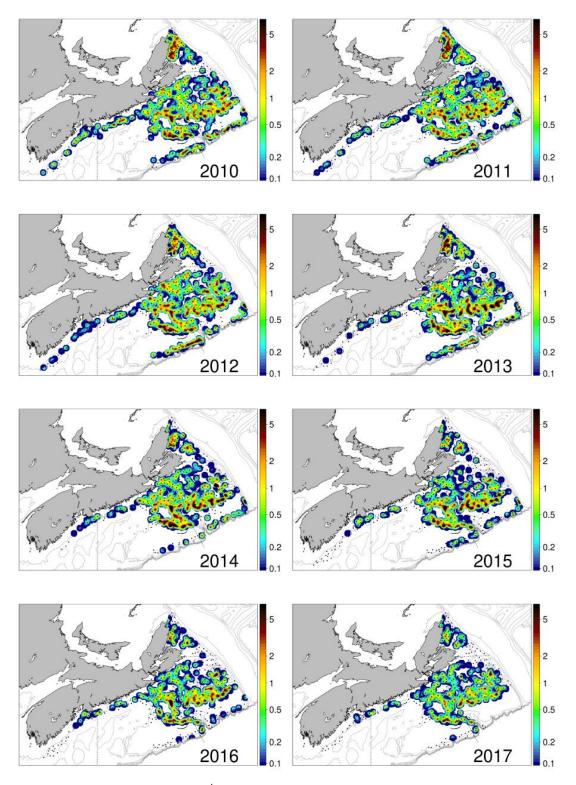


Figure 69. Fishable biomass densities  $\frac{t}{kn^2}$  on the SSE with spatial representation generated using thin plate spline interpolations of data from the annual Snow Crab survey.

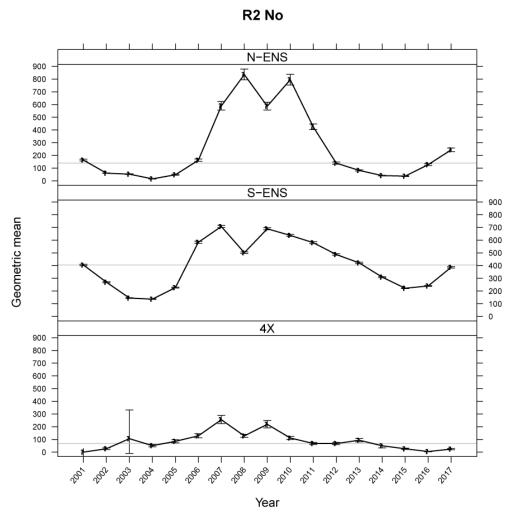


Figure 70. Trends in the geometric mean abundance of male Snow Crab (75-95 mm CW) obtained from the annual Snow Crab survey. Error bars are 95% CI about geometric mean.

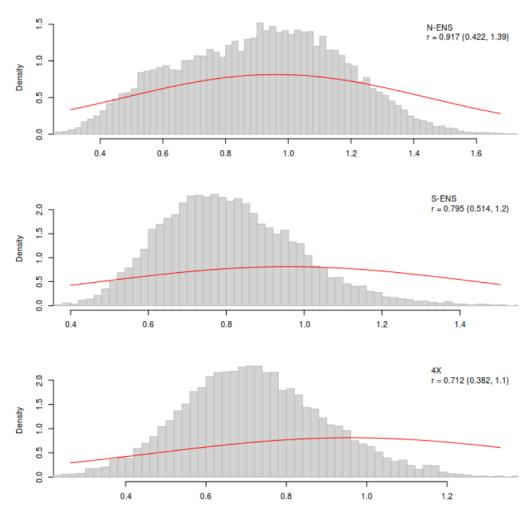


Figure 71. Prior (red) and posterior (bars) distribution for population growth parameter, r, from the biomass dynamic model of Snow Crab production in crab fishing areas on the Scotian Shelf. Within each panel, estimates of posterior median and 95% credible intervals are given in the legend.

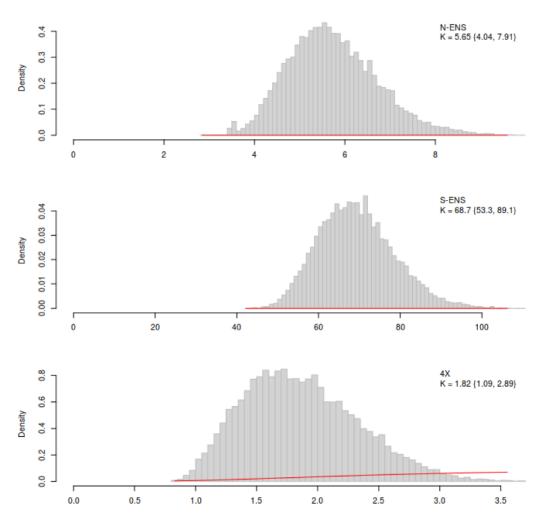


Figure 72. Prior (red) and posterior (bars) distribution for carrying capacity parameter, K, from the biomass dynamic model of Snow Crab production in crab fishing areas on the Scotian Shelf. Within each panel, estimates of posterior median and 95% credible intervals are given in the legend.

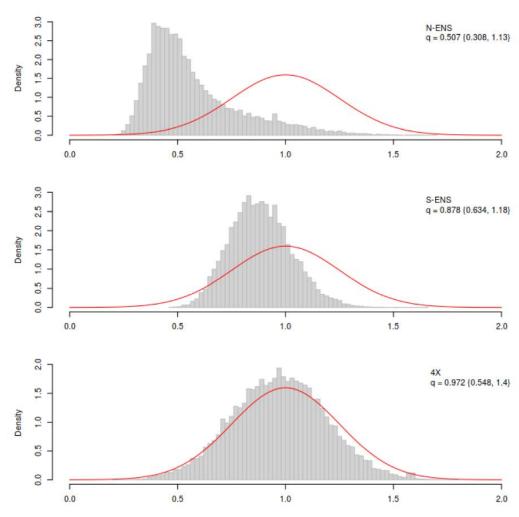


Figure 73. Prior (red) and posterior (bars) distribution for catchability parameter, q, from the biomass dynamic model of Snow Crab production in crab fishing areas on the Scotian Shelf. Within each panel, estimates of posterior median and 95% credible intervals are given in the legend.

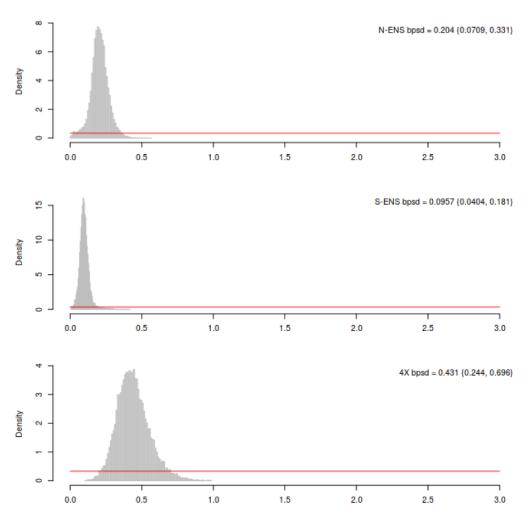


Figure 74. Prior (red) and posterior (bars) distribution for process error from the biomass dynamic model of Snow Crab production in crab fishing areas on the Scotian Shelf. Within each panel, estimates of posterior median and 95% credible intervals are given in the legend.

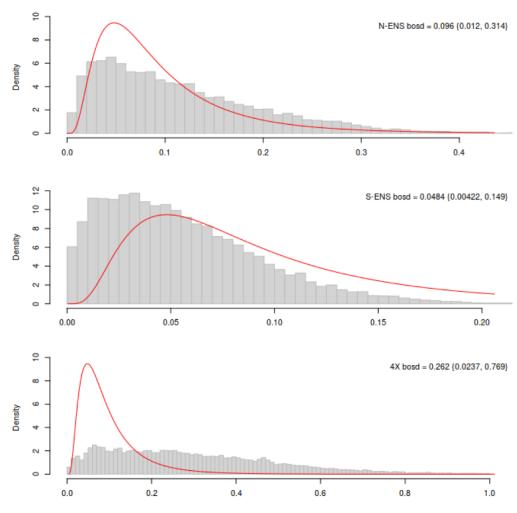


Figure 75. Prior (red) and posterior (bars) distribution for observation error from the biomass dynamic model of Snow Crab production in crab fishing areas on the Scotian Shelf. Within each panel, estimates of posterior median and 95% credible intervals are given in the legend.

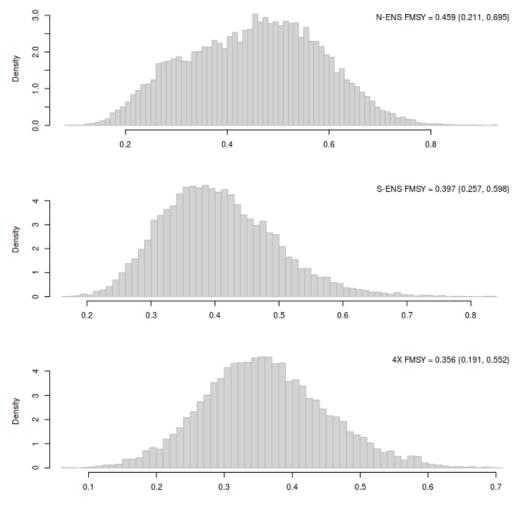


Figure 76. Posterior distribution for fishing mortality at maximum sustainable yield from the biomass dynamic model of Snow Crab production in crab fishing areas on the Scotian Shelf. Within each panel, estimates of posterior median and 95% credible intervals are given in the legend.

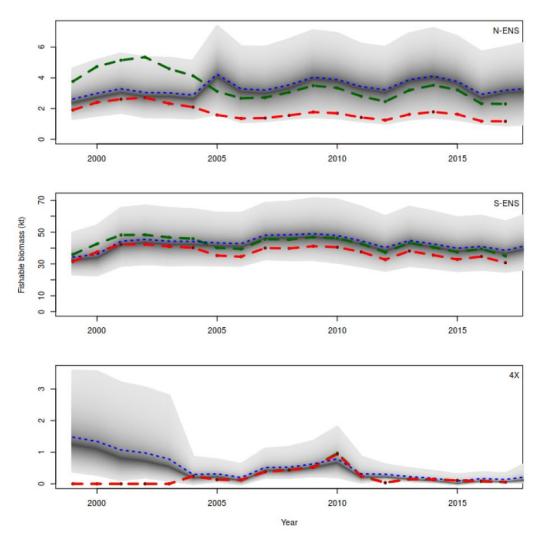


Figure 77. Time series of fishable biomass from the logistic population models. The fishable biomass index is shown in red dashed lines. The q-corrected fishable biomass index is shown in green dashed lines. The posterior mean fishable biomass estimated from the logistic model are shown in blue stippled lines. The density distribution of posterior fishable biomass estimates are presented with 95% CI (grey) with the darkest area being medians.

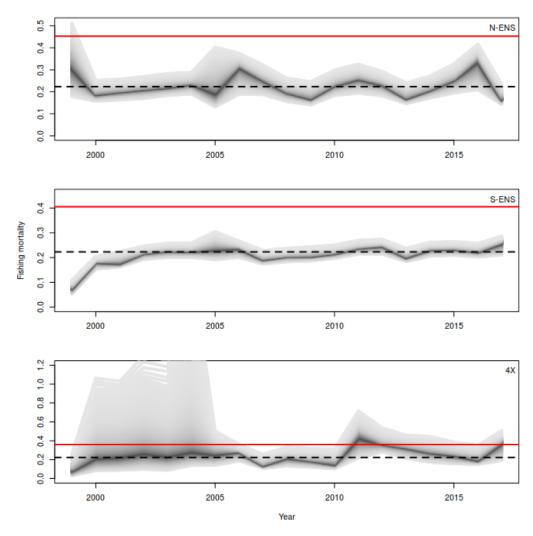


Figure 78. Time-series of fishing mortality from the logistic population models for N-ENS, S-ENS and 4X, respectively. Posterior density distributions are presented in grey, with the darkest line being the median with 95% CI. The red line is the estimated  $F_{MSY}$  and dark stippled line is the 20% harvest rate.

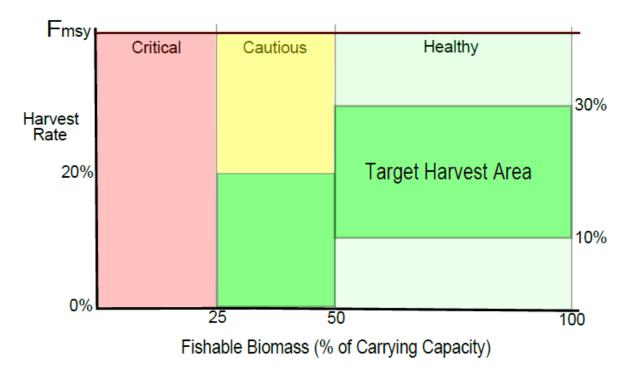


Figure 79. Harvest control rules for the SSE Snow Crab fishery.

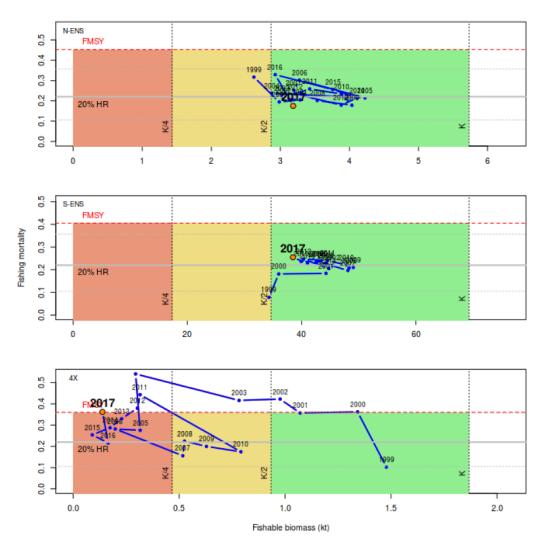


Figure 80. Time series of fishing mortality and pre-fishery biomass for N-ENS (top), S-ENS (middle) and 4X (bottom) as obtained from the logistic population models.

### **APPENDICES**

## APPENDIX 1: SPATIO-TEMPORAL MODELS OF VARIABILITY

### Introduction

Ecological and biological processes demonstrate variability in space and in time. Characterizing this variability and understanding them is relevant for understanding the processes and characterizing/predicting them. Sampling design tries to approach such issues by trying to balance information obtained vs costs of sampling. Strategies can range from completely random sampling in the absence of additional information, to some form of stratified random design that randomly chooses samples from strata constrained by factors believed to be pertinent or informative. A common one is of course areal stratification based upon some prior knowledge that is known or believed to be informative (e.g., depth, temperature or some oceanic feature), such that the variability within strata will be smaller than that between strata. The lower the variability within strata (relative to between-strata variability), the better the stratification of spatial areas ("design") has captured local homogeneities in the process of interest (e.g., abundance of some organism); that is, each sample is thought to be more representative of the stratum that it represents.

The problem of course is that the size of these strata can shrink to unmanageable numbers as the number of informative factors increase and the kinds of processes also increase. Further, the locations of such strata can shift if they are based upon features that are not geographically fixed, such as with temperature, oxygen levels, abundance of prey or predators, light levels, etc. This approach, therefore, crudely "adjusts" for the influence of these "extraneous" factors by a crude re-weighting of the total variance such that they can thereafter be ignored. These factors are, however, highly informative and ignoring them for the sake of simplicity by "factoring them out" can lead to erroneous conclusions about the focal process(es) of interest, especially when they are dynamic.

There exist two main approaches towards incorporating such additional information: (1) a spatially continuous process and (2) spatially aggregated areal units. Both approaches decompose the spatial patterns into those that are associated with: informative factors; structured spatial autocorrelation patterns; and completely spatially unstructured errors. In the following, we will summarize the general background to the field, following closely Banerjee et al.'s (2004) exceptionally clear and thorough exposition of these ideas. To assist in the context of stock assessment and general spatial and spatiotemporal modeling of potentially large areas, some of these methods have been formulated in an R Package, "stmv" (https://github.com/jae0/stmv). This document will also serve to document these methods.

# **Continuous Representation**

# Spatial Autocorrelation

To be precise, we focus upon any spatially referenced observation  $Y_s$  at locations s, measured in a coordinate space whose domain D has dimensionality d such that  $\{s \in D \in \Re^d\}$ . We focus upon the simple case of d=2 spatial dimensions, such that for example, s=(northing,easting). The observations  $Y_s$  are assumed to be realizations of a **spatial stochastic process**, y, that is some latent unobservable but real, stochastic, generative function (i.e., a spatial random field) such that  $y_s \to Y_s$  at  $\{k=1,\ldots,K\}$  spatial locations. The manner in which the variability of  $y_s$  changes as a function of distance,  $h=\|s-s'\|$ , is known as the spatial autocorrelation function. The  $\|\cdot\|$  indicate a norm which in d=2 dimensions is the Euclidean distance,  $h=(\Delta northing^2+\Delta easting^2)^{1/2}$ .

The spatial model is expressed as a regression model of a stochastic process (Banerjee et al. 2004):

$$Y_s = g(x_s^T \beta + \omega_s + \varepsilon_s),$$

where, the observations  $Y_s$  are a function of some mean process  $x_s^T\beta$  (sometimes referred to as "external drift" in the kriging literature), and a residual error process  $(\omega_s + \epsilon_s)$ , operating potentially under the context of Generalized Linear Models via the link function  $g(\cdot)$ . The  $x_s$  are spatially referenced predictors with associated parameters  $\beta$ . The residual error process is decomposed into spatially structured  $\omega_s$  and spatially unstructured  $\epsilon_s$  components, both with mean of zero. The latter is also commonly called the "nugget" error in geostatistics and used to represent measurement and/or microscale variability/processes; it is usually assumed to have a Normal distribution and standard deviation  $\sigma_\epsilon$ . The spatial error is assumed to follow a **Gaussian process** with mean 0 and a spatial covariance function  $C(s,s';\theta)$  that describes form of the variance of the process as a function of distance between data, controlled by the parameters  $\theta$  and spatially structured standard deviation  $\sigma_\omega$  (see below). The full model specification is, therefore:

$$\begin{array}{lll} Y_s & = & \mu_s, \\ g(\mu_s) & = & x_s^T\beta + \omega_s + \epsilon_s, \\ \epsilon_s & \sim & N(0,\sigma_\epsilon^2), \\ \omega_s & \sim & GP(0,C(s,s';\theta)). \end{array}$$

The above is equivalent to assuming a Multivariate Normal likelihood for the observations  $Y = (Y_{s_1}, ..., Y_{s_K})^T$ , with mean  $\mu = \left[x_{s_i}^T\right]_{i=1}^K \beta$  and a covariance matrix  $\Sigma = \left[C(s_i, s_j; \theta)\right]_{i,j=1}^K + \tau^2 I_K$ , such that  $Y \sim \text{MVN}(\mu, \Sigma)$ ; with  $I_K$  an identity matrix of size K. It is also computationally more efficient as fewer likelihood evaluations are conducted and fast and sparse implementations of the Multivariate Normal exist.

The spatial covariance function  $C(h) = C(s, s'; \theta)$  expresses the tendency of observations closer together to be more similar to each other than those further away. Commonly used forms include:

$$\begin{array}{lll} C(h)_{Spherical} & = & \begin{cases} \sigma_s^2(1-\frac{3}{2}h/\varphi+\frac{1}{2}(h/\varphi)^3); & 0 < h <= \varphi \\ 0; & h > \varphi, \end{cases} \\ C(h)_{Exponential} & = & \sigma_s^2e^{-h/\varphi}, \\ C(h)_{Gaussian} & = & \sigma_s^2e^{-(h/\varphi)^2}, \\ C(h)_{Powered\ exponential} & = & \sigma_s^2e^{-(h/\varphi)^2}, \\ C(h)_{Matérn} & = & \sigma_s^2\frac{1}{2^{\nu-1}\Gamma(\nu)}(\sqrt{2\nu}h/\varphi)^{\nu}\ K_{\nu}(\sqrt{2\nu}h/\varphi). \end{cases}$$

At zero distance,  $C(0) = Cov(Y_s, Y_s) = Var(Y_s) = \sigma_\epsilon^2 + \sigma_s^2$  (i.e., global variance), where  $\sigma_\epsilon$  is the nonspatial, unstructured error,  $\sigma_s$  is the spatially structured error, and  $\theta = \{\varphi, \nu, p, ...\}$  are function-specific parameters including  $\varphi$  the range parameter.  $\Gamma(\cdot)$  is the Gamma function and  $K_{\nu}(\cdot)$  is the Bessel function of the second kind with smoothness  $\nu$ . The Matérn covariance function is frequently used in the more recent literature as the shape of this function is more flexible (Figure A1.1).

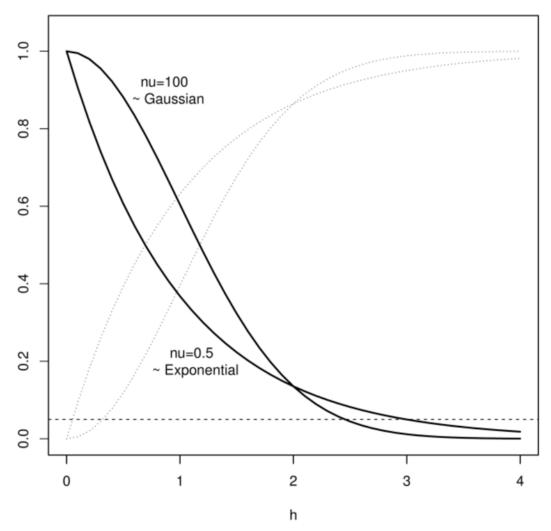


Figure A1.1. Matérn autocorrelation function,  $\rho(h) = C(h)/C(0)$ , the covariance function C(h) scaled by the total variance C(0), for two values of v (dark lines). As v increases (v = 100), it approaches the Gaussian curve (upper dark curve on the left side) while at smaller values (v = 0.5) the curve is exponential (lower dark curve on the left side). This flexibility has made it a popular choice in geostatistics. The associated semivariograms (scaled to unit variance)  $\gamma(h)$  are shown in light stippled lines. Spatial scale is defined heuristically as the distance h at which the autocorrelation falls to 0.05 (dashed horizontal line) – in this example between 2.5 and 3 distance units, depending upon value of v. The semivariance (also called "semivariogram")  $\gamma(h)$ , is more commonly used in the kriging literature, and is simply the covariance function C(h) reflected on the horizontal axis of the global variance C(0) such that  $\gamma(h) = C(0) - C(h) = \frac{1}{2} Var[Y_s - Y_s'] = \sigma_\omega^2[1 - \rho(h)]$ .

Defining the spatial scale of a given observation or process is imperative for the development of any ecological assessment or monitoring. The **spatial autocorrelation function** is defined as the covariance function scaled by the global variance:  $\rho(h) = C(h)/C(0)$ . Heuristically, we define the **spatial autocorrelation scale** to be the distance at which the spatial autocorrelation decreases asymptotically to  $\rho(x) \to 0.05$  (occasionally called the "practical" range in the literature). This spatial scale of an ecological process is informative in that when short-range processes dominate relative to the scale of the whole domain, such as when focusing upon less mobile species, weakly dispersing, low currents, habitat heterogeneity; then monitoring these processes can be meaningful and fruitful in discriminating what is structuring an area of interest.

If, however, long-ranging processes dominate relative to the scale of the whole domain, such as when focusing upon higher mobility species or dispersal processes/current, and stronger spatial connectivity, habitat heterogeneity, then there is a lower likelihood that monitoring such processes will provide insights to the internal structure of the area of interest.

This is perhaps clearest when spatial scale is studied in the context of specific organisms. For example, when a spatial feature (e.g., abundance distribution in space) demonstrates short characteristic spatial scales (i.e., a lot of spatial variability at smaller scales), sampling approaches must respect this and similarly operate at such shorter scales or even smaller if one is to be able to resolve the patterns and describe properly the subject of interest. Similarly, if a spatial feature is long-ranged and one wishes to resolve the patterns properly, then a sampling protocol must be similarly long-ranged to resolve the pattern. A sampling program much smaller than the characteristic spatial scale would be beneficial, but the accrued benefits relative to cost of sampling would diminish rapidly. In that time, effort and resources requirements generally increase more rapidly than any benefit (e.g., in the simplest case, if one is looking only naively at standard error as a measure of benefit, then it would increase asymptotically with increased effort with a power of -1/2).

# **Temporal Autocorrelation**

Ecological systems being dynamic, also exist in a temporal frame. As such, similar to the above spatial considerations, there also exists some characteristic temporal scale upon which the processes internal to an area of interest and time period of interest operate. The canonical example is how some quantity changes from one time period to another. This discrete-time notion of temporal autocorrelation is the slope parameter from a plot of a variable as a function of itself with an offset of one time unit:

$$v_{t+1} = \rho v_t + \eta_t,$$

with  $\eta_t \sim N(0,\sigma_t^2)$  and a temporal (linear) autocorrelation parameter  $\rho.$  This is known as an AR(1) process, where the 1 indicates 1 unit time lag. More complex models with moving averages and additional time-lags can also be specified. Collectively these are known as AR, ARMA, and ARIMA models. The difficulty with these autocorrelation timeseries formulations is the requirement of a complete data series without missing data.

The **cumulative periodogram** expresses the variance  $f(\omega)$  as a function of temporal distance (wavelengths  $\omega$ ) and so is an analogue of the spatial semivariogram. It is a discrete sample estimate of the continuous concept of spectral density,  $\gamma(t)$ :

$$\gamma(t) = \int_{-1/2}^{1/2} \! e^{2\pi i \omega t} \, f(\omega) d\omega \quad \leftrightarrow \quad f(\omega) = \sum_{h=-\infty}^{h=\infty} \! \gamma \, (t) e^{-2\pi i \omega t}.$$

Usefully, as the autocovariance and spectral density are Fourier transform pairs, a Fast Fourier Transform can be used to rapidly assess the power spectrum and determine the empirical form of the periodogram.

Indeed, any spatial autocorrelation function (above) can be used to describe the empirical form of the temporal autocorrelation pattern and modeled in a manner completely analogous to the spatial case as a **temporal stochastic process**,  $y_t$ , that is, some latent, unobservable but real, stochastic, generative function such that  $y_t \to Y_t$ , where  $Y_t$  are any temporally referenced observation at some time t, measured in a coordinate space whose domain D has dimensionality 1 such that  $\{t \in D \in \Re\}$  with  $\{l = 1, ..., L\}$  temporal locations. The manner in which the variability of  $y_t$  changes as a function of the norm (distance), h = ||t - t'||, is known as the

temporal autocorrelation function. The latter can take any form including the same as the spatial autocorrelation functions. The model formulation is identical to the spatial case:

$$\begin{array}{lll} Y_t & = & \mu_t, \\ g(\mu_t) & = & x_t^T \beta + \omega_t + \epsilon_t, \\ \epsilon_t & \sim & N(0, \sigma_\epsilon^2), \\ \omega_t & \sim & GP(0, C(t, t'; \theta)). \end{array}$$

The covariance function, for example, when expressed as an exponential decay model controlled by time range parameter  $\phi_t$  is:

$$C(t, t'; \theta_t) = \sigma_t^2 e^{-|h|/\phi_t}$$
.

Similar to the case of spatial scales, temporal scales also have a simple implication in terms of monitoring and assessment. Short time-range variations require higher sampling effort to resolve/understand the issues and vice-versa. As temporal scale is an informative metric for monitoring and assessment of an ecological process, we must be precise in its definition. The cumulative distribution permits a rapid identification of the time scale at which correlation drops to some arbitrary level. To be approximately comparable to the spatial scale, we define the **temporal autocorrelation scale** as the time difference (wavelength) at which the temporal autocorrelation function (1 - Cumulative Power Spectral Density) decreases to 5% of the total variance. If resolving short-term processes is a study's goal, then sampling must also necessarily be more frequent. However, similar to spatial scale issues, there is a point where there will be diminishing returns for any increase in the resolution of a temporal signal.

## Spatiotemporal Autocorrelation

In reality, spatial and temporal patterns coexist and co-evolve. They are correlated processes and as such a challenge to model properly. This renders the independent treatment and estimation of autocorrelation in time and space problematic. Nonetheless, new developments in computational methods are bringing such models within range of use. This is primarily due to efficient methods associated with numerical modeling of Stochastic Partial Differential Equations (SPDEs), and the use of spectral (Fourier) methods.

Again, following Banerjee et al.'s (2004) development, spatiotemporal models can be seen as a simple extension of the spatial regression model. The observations,  $Y_{s,t}$  are measured in a coordinate space  $\{(s,t)\in D\in\Re^d\times\Re\}$  in the domain D of dimensionality d+1 with  $\{k=1,...,K\}$  spatial and  $\{l=1,...,L\}$  temporal locations. The space-time regression model can then be specified as:

$$Y_{s,t} = g(\mu_{s,t} + \omega_{s,t} + \varepsilon_{s,t}),$$

where,  $\mu_{s,t} = x_{s,t}^T \beta_{s,t}$  is the mean process (or "external drift" in the kriging literature) and the error process is decomposed into a spatiotemporally structured component  $\omega$  and an unstructured component  $\epsilon$ , operating again under a generalized linear model framework, through the action of the link function  $g(\cdot)$ . The parameters  $\beta_{s,t}$  of the spatially and temporally referenced predictors  $x_{s,t}$  can have variable forms:

- β completely fixed with no variation in time and space;
- $\beta_{-,t}$  temporally varying and no spatial structure;
- $\beta_{s,-}$  spatially varying and no temporal structure;
- \$\beta\_{s,-}\text{\ensuremath{\divideontimes}}\beta\_{-,t}\$ space and time varying independently (separably, the "\*" indicates additive or multiplicative);

•  $\beta_{s,t}$ - varying in both time and space complex (nonseparable) and potentially hierarchically (nonsimply).

The unstructured error is assumed to be a Normal iid error process:  $\epsilon_{s,t} \sim N(0,\sigma_\epsilon^2)$ . However, the manner in which the spatiotemporally structured error should be parameterized is not straight-forward. Some common approaches include:

- $\omega_{-,t}$  temporal effects nested in sites (temporal autocorrelation at each site, no spatial autocorrelation);
- $\omega_{s,-}$  spatial effects nested in time (spatial autocorrelation at each time slice, no temporal autocorrelation);
- $\omega_{s,-}*\omega_{-,t}$  separable (spatial and temporal autocorrelations are independent, the "\*" indicates additive or multiplicative) with  $\omega_{-,t}\sim GP(0,C(t,t';\theta_t))$  and  $\omega_{s,-}\sim GP(0,C(s,s';\theta_s))$ ;
- $\omega_{s,t}$  non-separable (both time and space structure evolve in a nonsimple manner).

The spatial and temporal errors are usually assumed to be derived from a **Gaussian Process** with mean 0 and some covariance  $C(\cdot,\cdot;\theta)$ . The spatial covariance can be modeled with any spatial form such as:  $C(\Delta s)_{Mat\acute{e}rn} = \sigma_s^2 \frac{1}{2^{\nu-1}\Gamma(\nu)} (\sqrt{2\nu}|\Delta s|/\varphi)^{\nu} K_{\nu}(\sqrt{2\nu}|\Delta s|/\varphi)$ . Similarly, the temporal covariance can be formulated as any similar autocorrelation model such as:

$$C(\Delta t)_{Exponential} = \sigma_t^2 e^{-|\Delta t|/\varphi_t}$$
.

While conceptually coherent and elegant, the evaluation of the likelihoods in these models requires the repeated computation of the inverse of the covariance matrix  $\Sigma_{n\times n}$  of size n, an operation that scales with  $\mathcal{O}(n^3)$  operations. This has been a bottleneck to further development of these covariance-based methods in large scaled problems of space and space-time. Approximations have been suggested to overcome this computational limit: modeling the spatial process  $\omega$  with a lower dimensional process via kernel convolutions, moving averages, low rank splines/basis functions and predictive processes (projection of spatial process onto a smaller subset; Sølna and Switzer 1996; Wikle and Cressie 1999; Huang et al. 2004; Xu et al. 2005; Banerjee et al. 2004); approximating the spatial process as a Markov random field with Laplace and SPDE Approximations (Lindgren and Rue 2015); and approximating the likelihood of the spatial-temporal SPDE process with a spectral domain process (Sigrist et al. 2012).

In the spatiotemporal setting, separable models are almost always used for the sake of computational speed as this treats space and time independently, reducing the problems crudely from  $\mathcal{O}((KL)^3)$  to  $\mathcal{O}(K^3) + \mathcal{O}(L^3)$  operations; where K is the number of spatial locations and L the number of time slices. In reality, however, such separable models are usually inappropriate unless the study area is homogeneous and truly first and second order constant (i.e., constant mean, variance, across time and space), a fact that is seldom true in most ecological systems (see below).

### Spatiotemporal Models of Variability (stmv)

A central assumption of all spatial and spatiotemporal models is that the form and magnitude of the autocorrelation in space (and time) are stationary (constant mean and variance). This can be forced to be the case by modeling the mean effects and operating upon a residual error that is stationary. However, in practice, there is spatial heterogeneity of variance as well which cannot be easily modeled though a simple regression context. This is notoriously the case with biology where aggregation and behaviour is highly context (location and time) dependent (nonlinear).

In **stmv**, we address this nonstationarity and nonseparability of spatial and temporal structure and associated issues of computational speed and complexity by formulating a simplistic but operational approach to the overall spatiotemporal problem. This is done by reducing the problem into small manageable subdomains where assumptions of stationary are valid and modeling of spatiotemporal processes become computationally feasible. There is, therefore, some conceptual similarity of this approach to "geographically weighted regression" (e.g., Fotheringham et al. 2002) in that each subdomain can have their own model parameters  $\beta_{s,t}$ . However, we emphasize in **stmv**, it is not only the model parameters  $\beta_{s,t}$  that are permitted to be variable, but so too the spatiotemporal errors  $\phi_{s,t}$ .

To be more precise, in the spatiotemporal domain D, where  $\{(s,t) \in D \in \Re^d \times \Re | d=2\}$  defines the coordinate space, we also define statistical nodes  $\{N_{m=(1,\dots,M)}| m \in \Re^d\}$  in a spatial lattice (or conceivably as centroids of a mesh, though this is not yet implemented). The norm (distance) of data from each node is  $h_m = ||s_m, s_Y||$ . A local subdomain of a given node m is  $\{S_{m=(1,\dots,M)} \in D|h_m < h_u\}$  or more briefly as  $S_m$  which represents all locations within some distance to the statistical node  $\{h_u|C(h_u)_{Mat\acute{e}rn} = 0.05\}$ ; that is, the distance at which the local spatial autocorrelation drops to a negligible value (<0.05). The data found within the subdomain m is  $\{Y_{s,t}|(s,t) \in D|h_m < h_u\}$  which will be notationally abbreviated as  $Y_{s,t|m}$ .

Operating upon all components of the regression model is computationally prohibitive. Even with very simplistic Generalized Additive Model (GAM) or Generalized Additive Mixed effects Model (GAMM) parameterizations of spatial and temporal structure, the solutions take many days on fast machines (5 GHz CPU, 64GB RAM), depending of course upon the amount of data and resolution and model complexity. As a compromise between model complexity and computational speed, stmv uses a global covariate model  $F(\cdot) \equiv x_{s,t}^T \beta_{s,t}$  is parameterized using a linear, generalized linear or generalized additive model. Here,  $F(\cdot)$  represents some potential penalized basis splines of the covariate predictors and potentially some function  $g(\cdot)$  that represents a link function such that the residual error in the link-space can be assumed to be Normal with mean zero and standard deviation  $\sigma_{\phi}$ , the latter accounting for the residual error process  $\phi_{s,t}$ :

$$\begin{array}{lll} Y_{s,t} & = & \mu_{s,t}, \\ g(\mu_{s,t}) & = & F(\cdot) + \phi_{s,t}, \\ \phi_{s,t} & \sim & Normal(0,\sigma_{\phi}^2). \end{array}$$

The spatiotemporal structure is decomposed from this residual error process and so the approach is in fact quite similar to "regression kriging" and (universal) "kriging with external drift" (Hengl et al. 2004).

The local spatial autocorrelation scale is derived from a rapid (coarse grained) fit of the local residuals  $\phi_{s,t|m}$  to a Matérn autocorrelation function. To be symmetrical in time, one would also need to determine temporal nodes and define appropriate temporal autocorrelation scales. In practice, temporal data are often sparse and limiting in survey data and so data from all time periods are used. Once the approximate bounds of the subdomain are estimated, the  $\phi_{s,t|m}$  are modeled as some functional  $f_m(\cdot) \equiv \phi_{s,t|m}^T \beta_{s,t|m}$  a Fourier series with two harmonics, one interannual and one subannual (seasonal):  $f_m(\text{interannual}, \text{seasonal})$ . In other words, a full temporal autocorrelation (covariance) model is not used but rather one that uses only a subset of the components at fixed wavelengths. The spatial coordinate space (depth, northing and easting) are (optionally) used as covariate or covariate-smooths in a GAM as they can be informative when large variations in topography exist or sampling is sparse inside the subdomain  $f_m($  interannual, seasonal, northing, easting, depth ):

$$\begin{array}{lll} \phi_{s,t|m} & = & f_m(\cdot) + \zeta_{s,t|m}, \\ \zeta_{s,t|m} & \sim & Normal(0,\sigma^2_{\zeta|m}). \end{array}$$

Data are (optionally) weighted by the inverse squared distance  $h_m^{-2}$  from the coordinates of each statistical node m to make data closer to the area of interest and prediction more influential. The temporal autocorrelation is, therefore, carried by the individual temporal processes at each spatial datum and the temporally structured error  $\sigma_{t|m}$  is the variance component of the model  $f_m(\cdot)$ , that is,  $\sigma_{t|m} = Var[\phi_{s,t|m}] - \sigma_{\zeta|m}^2$ .

The spatial autocorrelation function is parameterized as being derived from the subdomain mean Gaussian process with a Matérn covariance function with parameters  $\theta_m = \{\varphi_m, \nu_m\}$  and a time-varying spatially structured standard error  $\sigma_{s|m}$ . As the data used to estimate the spatial autocorrelation structure are often sparse, the data are augmented by temporal predictions of the residual error process at each spatial datum (and notationally designated by an asterisk). These augmented residual processes are modeled independently for each time slice  $\phi_{s,t|m}^*$  as the sum of a time-varying spatial **Gaussian process**  $\omega_{s,t|m}$  parameterized as a Matérn spatial covariance function  $\sigma_{s,t|m}^2 \frac{1}{2^{\nu_{t|m}-1}\Gamma(\nu_{t|m})} (\sqrt{2\nu_{t|m}}h/\varphi_{t|m})^{\nu_{t|m}} K_{\nu_{t|m}} (\sqrt{2\nu_{t|m}}h/\varphi_{t|m})$  with a local spatial error  $\sigma_{s,t|m}$ ; and a spatially and temporally unstructured error process assumed to be derived from a Normal error process with mean zero and error  $\sigma_{s|m}$ :

$$\begin{array}{lll} \phi_{s,t|m}^* & = & \omega_{s,t|m} + \epsilon_{s,t|m}, \\ \omega_{s,t|m} & \sim & \text{GP}(0,\text{C}(s,s';\theta_{t|m} = \{\nu_{t|m},\varphi_{t|m},\sigma_{t|m}\})), \\ \epsilon_{s,t|m} & \sim & \text{Normal}(0,\sigma_{\epsilon|m}^2). \end{array}$$

Other more flexible and complex models can be defined in this framework and they will be expanded upon in a future document. The above represents the basic approach that provides a practical balance between computational time and model complexity/realism. A fully Bayesian approach is being developed that removes the need to work with external drift.

### The Snow Crab Assessment

The Snow Crab estimation process interpolates a number of covariates to the same continuous spatial support as they are surveyed using alternate survey designs. This is required to refine predictions of Snow Crab abundance and habitat while avoiding issues of bias due to aliasing (also known as upscaling and downscaling issues). Some of these covariates change on geological time scales relative to the timescale of the biological and ecological processes of interest and so can be considered functionally a "pure" spatial model (though of course they are not truly static). And others that are more biological in nature vary at similar or even shorter time scales and so require a temporal component. Here we detail some of these core data sources and their model assumptions in the context of the temporal autocorrelation scale of Snow Crab abundance in the Maritimes Region of Canada. The methods are encoded in the aegis R Package (<a href="http://github.com/jae0/aegis">http://github.com/jae0/aegis</a>).

Bathymetry (depth; m) is a spatial covariate which is informative in that it determines ambient light levels, surface complexity/rugosity, hydrodynamic stability and overall environmental stability. Here, it is modeled as a Lognormal process:

$$\begin{array}{lll} Y_s & = & \mu_s, \\ \log(\mu_s) & = & F(constant\ offset) + \phi_s, \\ \phi_s & \sim & Normal(0,\sigma_\phi^2), \\ \phi_{s|m} & = & \omega_{s|m} + \epsilon_{s|m}, \\ \omega_{s|m} & \sim & GP(0,C(s,s';\theta_m=\{\nu_m,\varphi_m,\sigma_m\})), \\ \epsilon_{s|m} & \sim & Normal(0,\sigma_{\epsilon|m}^2). \end{array}$$

As it is a pure space model, there is no need to "augment" the data leaving a direct decomposition of the global residual error process  $\phi_{s|m}$  into a local spatial process  $\omega_{s|m}$  and a local unstructured error  $\epsilon_{s|m}$ .

Similarly, substrate grain size (mm) is a pure space model, which is a proxy measure of the type of substrate (mud, sand, gravel, rock, etc.) and so informative for benthic, demersal and infaunal habitat. It is also modeled as a Lognormal process:

$$\begin{array}{lll} Y_s & = & \mu_s, \\ \log(\mu_s) & = & F(\text{depth, slope, curvature}) + \phi_s, \\ \phi_s & \sim & \text{Normal}(0, \sigma_\phi^2), \\ \phi_{s|m} & = & \omega_{s|m} + \epsilon_{s|m}, \\ \omega_{s|m} & \sim & GP(0, C(s, s'; \theta_m = \{\nu_m, \varphi_m, \sigma_m\})), \\ \epsilon_{s|m} & \sim & \text{Normal}(0, \sigma_{s|m}^2). \end{array}$$

Temperature is a fundamentally important to metabolism, growth, reproduction, predator and prey distribution and abundance, and disease incidence. Bottom temperatures, in particular, are the focus due to their relevance to benthic and demersal organisms and modeled as an hierarchical, spatiotemporal, "inseparable" spatiotemporal process. As their variations have high frequency variations, some additional complexity is required in modeling their spatiotemporal variations. Here, the temporal effects are nested in spatial subdomains S<sub>m</sub>. The global covariate model is simply a intercept model with an identity link such that  $\varphi_{s,t}$  are centered upon zero. Salinity or water density data can conceivably enter to delineate water masses and origins; however, this data does not exist at sufficient density and coverage to be informative enough to merit the additional computational load (at present). Instead, the residuals errors are modeled locally in each subdomain as a weighted timeseries with two Fourier harmonics in time (an interannual and a subannual/seasonal component). The weights are determined from the inverse squared distance from each statistical node h<sub>m</sub>. Additional penalized thin-plate spline smooth terms for local depth and position are used to resolve local spatial trends and aliasing to third order or less (via shrinkage). Temporal predictions at each spatial datum are then used to "augment" the modeling of the spatial processes  $\phi_{s,t|m}^*$ , which are treated independently for each time slice as a Gaussian process. The temporal autocorrelation is, therefore, carried only indirectly by the individual temporal processes centered at each spatial datum. For faster computations, a Fast Fourier Transform (FFT) based convolution method is used to approximate the spatial Gaussian process. The model specification is, therefore:

$$\begin{array}{lll} Y_{s,t} & = & \mu_{s,t}, \\ \mu_{s,t} & = & F(identity) + \phi_{s,t}, \\ \phi_{s,t} & \sim & Normal(0,\sigma_{\phi}^2), \\ \phi_{s,t|m} & = & f_m(interannual, seasonal, northing, easting, depth) + \zeta_{s,t|m} \\ \zeta_{s,t|m} & \sim & Normal(0,\sigma_{\zeta|m}^2), \\ \phi_{s,t|m}^* & = & \omega_{s,t|m} + \epsilon_{s,t|m}, \\ \omega_{s,t|m} & \sim & GP(0,C(s,s';\theta_{t|m} = \{\nu_{t|m},\varphi_{t|m},\sigma_{t|m}\})), \\ \epsilon_{s,t|m} & \sim & Normal(0,\sigma_{\epsilon|m}^2). \end{array}$$

Additional covariates that express the ecosystem state at a given time and location ("indicators") are informative in delineating spatiotemporal processes that are structured from those that are random. Their model formulation is similar in that they follow a similar model structure with temporal effects nested in spatial subdomains and the use of link functions in a Generalized Linear Model/Generalized Additive Model setting where the covariates used to model these indicators rely upon spatial predictions of depth and substrate grain size and the spatial derivatives of the former (slope and curvature). The spatiotemporal error process is modeled locally in each subdomain as a space-time "inseparable" model, using time-varying covariates related to bottom temperature variations and associated statistics:

$$\begin{array}{lll} Y_{s,t} & = & \mu_{s,t}, \\ g(\mu_{s,t}) & = & F(\text{depth, slope, curvature, substrate grainsize}) + \phi_{s,t} \\ \phi_{s,t} & \sim & \text{Normal}(0,\sigma_{\phi}^2), \\ \phi_{s,t|m} & = & f_m(\text{interannual, seasonal, northing, easting, depth}) + \zeta_{s,t|m} \\ \zeta_{s,t|m} & \sim & \text{Normal}(0,\sigma_{\zeta|m}^2), \\ \phi_{s,t|m}^* & = & \omega_{s,t|m} + \epsilon_{s,t|m}, \\ \omega_{s,t|m} & \sim & GP(0,C(s,s';\theta_{t|m} = \{\nu_{t|m},\varphi_{t|m},\sigma_{t|m}\})), \\ \epsilon_{s,t|m} & \sim & \text{Normal}(0,\sigma_{\epsilon|m}^2). \end{array}$$

For the estimation of habitat preferences and the creation of species distribution maps that rely upon presence-absence data. The data Y are assumed to come from a Bernoulli binomial process with a logit link function  $g(\cdot)$ :

$$\begin{array}{lll} Y_{s,t} & = & \mu_{s,t}, \\ logit(\mu_{s,t}) & = & F(depth, slope, curvature, substrate grainsize) + \phi_{s,t} \\ \phi_{s,t} & \sim & Normal(0,\sigma_{\phi}^2), \\ \phi_{s,t|m} & = & f_m(ecosystem indicators) + \zeta_{s,t|m} \\ \zeta_{s,t|m} & \sim & Normal(0,\sigma_{\zeta|m}^2), \\ \phi_{s,t|m}^* & \sim & \omega_{s,t|m} + \epsilon_{s,t|m}, \\ \omega_{s,t|m} & \sim & GP(0,C(s,s';\theta_{t|m} = \{\nu_{t|m},\varphi_{t|m},\sigma_{t|m}\})), \\ \epsilon_{s,t|m} & \sim & Normal(0,\sigma_{s|m}^2). \end{array}$$

For the estimation of abundance, the positive valued data Y are assumed to come from a lognormal process:

```
Y_{s,t}
                                                                       \mu_{s,t}
                          F(depth, slope, curvature, substrate grainsize) + \phi_{s,t}
log(\mu_{s,t})
                                                             Normal(0, \sigma_{\omega}^2),
    \phi_{s,t}
                                            f_m(ecosystem indicators) + \zeta_{s,t|m}
  \varphi_{s,t|m}
                                                           Normal(0, \sigma_{lm}^2),
   \zeta_{s,t|m}
  \phi_{s,t|m}^*
                                                             \omega_{s,t|m} + \varepsilon_{s,t|m}
                                       \text{GP}(0,\text{C}(s,s';\theta_{t|m}=\{\nu_{t|m},\varphi_{t|m},\sigma_{t|m}\}))\text{,}
  \omega_{s,t|m}
                                                           Normal(0, \sigma_{\rm elm}^2).
  \varepsilon_{s,t|m}
```

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#### APPENDIX 2: CONTEXT OF THE PRECAUTIONARY APPROACH

In the context of natural resource management, the precautionary approach (PA) identifies the importance of care in decision making by taking into account uncertainties and avoiding risky decisions. This is because natural ecosystems are intrinsically complex and unexpected things can and often do happen (e.g., Choi and Patten 2001). The origin of the PA is diffuse but has its first precursor in Rachel Carson's 1962 book, Silent Spring, which caused widespread concern about the use of synthetic pesticides and eventually resulted in the abolition of Dichlorodiphenyltrichloroethane (DDT) in many parts of the affluent world. The Stockholm Declaration of the United Nations Conference on the Human Environment (UNCHE 1972) was the first international environmental law recognizing the right to a healthy environment. This was taken a little further by the World Commission on Environment and Development (WCED 1987, or the Brundtland Commission's Report "Our Common Future"), which highlighted the need for sustainable development. Subsequently, another conference was undertaken in Rio de Janeiro. Brazil (1992), which attempted to establish international agreements to protect the integrity of the environment while recognizing state sovereignty and, therefore, state responsibility for providing equitable resources for both present and future generations. Sustainable development, public participation in the decision making process (especially youth, indigenous people and women), environmental impact assessments and management in particular of environmental pollution and degradation, especially when harmful to human health, were key points of agreement.

Many other international agreements were undertaken that re-affirmed these positions: the UN Convention on the Law of the Sea (UNCLOS 1982) that recognized territorial jurisdiction with a pollution focus in the Exclusive Economic Zone; the FAO (1995) Code of Conduct for Responsible Fisheries emphasizing conservation and the PA, promoting selective fishing gear and responsible fishing methods; the UN Fishing Agreement (UNFA 2001) dealing with straddling and highly migratory fish stocks; the UN Convention on Biological Diversity which identified Ecosystem-Based Management as a global responsibility; the World Summit on Sustainable Development (WSSD 2002) in Johannesburg reaffirmed the common agreement to "maintain or restore stocks to levels that can produce the maximum sustainable yield with the aim of achieving these goals for depleted stocks on an urgent basis and where possible not later than 2015".

Canada, as a signatory to these international agreements, has a legally binding obligation to manage natural resources using a PA (Shelton and Sinclair 2008). Ultimately, a PA means to not risk the long-term sustainability of the resource in focus and the ecosystem in which it is embedded. Fortunately, fostering the long-term sustainability of a natural resource in a fishery context also has the direct consequence of fostering the highest possible catch rates (CPUE) and associated socio-economic benefits of an efficient and vigorous fishery. Fostering the long-term biological and ecological sustainability can, therefore, foster the long-term socio-economic sustainability of the dependent industry.

### Sustainability

Implementing a PA to resource management requires the careful consideration of all sources of information relating to the sustainability of both the resource in focus and the ecosystem in which it is embedded: scientific and traditional information and associated uncertainties. A further requirement is a transparent mechanism for synthesizing this information and measuring the sustainability of the resource. The latter is required in order to provide feedback upon the success or lack thereof of specific management actions. To address this requirement, DFO (2006) suggested the use of spawning stock biomass (SSB) as a measure of "sustainability". High levels of SSB were to be considered "healthy" and low levels "unhealthy". Similarly, in the

Snow Crab fishery, the focus is naturally upon the exploitable component: the "fishable biomass". If the relative abundance of fishable biomass is high, most fishers, fisheries managers and fisheries scientists would consider it to be in a more "sustainable" state, and vice versa.

Unfortunately, this perspective is problematic. High abundance can cause a destabilization and collapse of a population through over-crowding, habitat degradation, disease and other density-dependent mechanisms. Well known examples include deer on islands that eventually overpopulate and eat themselves to extinction; humans on Easter Island that have over-harvested trees leading to population, societal and ecological collapses; or, the over-dominance of species (monocultures in farms and forests) that results in disease or fire outbreaks and eventually large-scale collapse (Diamond 2005). A high abundance does not necessarily equate to high sustainability. The problem lies with not the metric, but rather the focus upon a single indicator. Sustainability is a multidimensional concept that requires reliance upon a broader set of criteria that describes both the resource status and relationships between the focal resource and the surrounding ecosystem (Choi and Patten 2001).

For example, a sustainable Snow Crab population requires, *at a minimum*: stable and positive levels of egg production, recruitment and stable and comparable levels of natural mortality and ecosystem structure and function. "Natural mortality" and its converse, "recruitment" are of course catch-all terms that are actually quite complex, involving age and size structure, sex ratios, genetic diversity and numerous ecosystem-level interactions (e.g., habitat variability, resource availability, predation, contaminant loads, disease prevalence, nutrient regeneration and mixing, carbon flux, control of invasive species). Any rapid change in one or more of these potential determinants of sustainability can undermine the long-term sustainability of Snow Crab. As all of these factors are variable in time and space, the stock assessment of Snow Crab in the ESS is highly attentive of these potential determinants of population and ecosystem sustainability.

The primary tools of fishery management are the control of fishing catch and effort. Generally, by reducing catch and effort, stock status and/or ecosystem context is expected to improve. However, the lack of recovery of cod since the cod-moratorium in the early 1990s in Atlantic Canada, suggests that even this "universal" expectation of fisheries control is more a belief than reality. A more risk-averse management approach would, therefore, seem to be prudent. For the Snow Crab fishery, the need for additional precaution is further demanded by the fact that the Scotian Shelf is the southern-most limit of the spatial distribution of Snow Crab. If environmental fluctuations occur in oceanographic currents and bottom temperatures, this is the area that can be expected to be most significantly influenced by such changes.

Ultimately, a population that is "sustainable" is one that is able to maintain the tenuous balance between the various conflicting demands placed upon it by the ecosystem in which it resides, in addition to the humans that influence or exploit it. The maintenance of this balance operates on many space-time scales and, therefore, requires adaptability (long-term – evolutionary processes) and resilience (short-term – ecological and population dynamic processes). To increase the chances that fishing practices and management actions will result in a sustainable resource, the fisheries influence must simply be small enough that the ability of a population to maintain this balance (adaptability and resilience) is not overtly disturbed or damaged. This requires that the footprint of the fishery (i.e., magnitude of its influence upon this ability) be small, relative to the biological footprint of the population (i.e., magnitudes of egg production, recruitment, "natural" mortality, and numerous other ecosystem-level processes).

Significantly, as the footprint of a fishery is itself context dependent (i.e., population and ecosystem), the use of fixed biological limit reference points of a single indicator is not at all PA-compliant as they are not sensitive to natural and human-induced alterations in the ecosystem

context. To determine appropriate thresholds and reactive/mitigative measures for each ecosystem trait is also untenable due to the sheer size and complexity of the SSE and the longevity of the Snow Crab. However, relevant indicators are evaluated to at least detect rapid alterations. This information is used qualitatively and quantitatively to provide the context by which the Snow Crab fishery footprint is assessed. The magnitude of the fishery footprint is minimized aggressively when greater uncertainty is associated with this context (environmental variability, age and size structure irregularities, etc.). For example, if recruitment is poor or environmental conditions erratic, then a more conservative approach (lower exploitation rate) is adopted. Further, all scientific information is brought forward and deliberated in an open and transparent manner with scientists, managers, fishers, aboriginal groups and various stakeholders, as per the Rio Accord (UNCED 1992).

#### **Reference Points**

Many pre-existing existing management measures and fishing practices in the Snow Crab fishery on the SSE are precautionary:

- Reproductive potential of the spawning stock biomass is not disrupted as only mature males are exploited. The fishery does not remove females.
- Mature males are exploited mostly after the mating season (spring), reducing the possibility
  of sperm-limitation and potential genetic selection towards earlier (i.e., smaller) size at
  maturity.
- Conservative exploitation strategies have generally been the norm, especially in recent years. Harvest rates are amongst the lowest in the Northwest Atlantic, usually ranging from 10% to 30% of the fishable biomass. This precaution is warranted as this stock is at the southern-most limit of the spatial distribution of Snow Crab in the western Atlantic. If fluctuations occur in environmental factors, such as oceanographic currents and/or bottom temperatures, this area could be significantly influenced. Further, the persistent collapse of groundfish in the area suggests that species in this area may be susceptible to collapse and subsequent existence in a collapsed state.
- Refugia from directed fishing pressures exist in the Gully MPA, in the St Anns Bank MPA, along the continental slope, and much of the western inshore portion of CFA 24. Movement within all subareas has been observed, with mean distance traveled being 10-20 km/annum, with high variability (>200 km/annum maximum).
- Sub-legal (<95 mm CW) mature males and immature males are able to mate. As a result, even if the abundance of commercially exploitable mature males were severely depleted, this would not be a conservation issue. This is especially the case as female crab are not exploited.
- Immature and soft-shelled (newly-molted, easily damaged) crab are not harvested and handling mortality is minimized via voluntary area closures and at-sea-observer monitoring of soft-shell incidence helping to maximize the potential yield per animal to the biomass.
- Traditional and fishers' knowledge is incorporated by DFO Science into assessment approaches; fostering self-knowledge and long-term sustainability perspectives/stewardship by industry. This is achieved through open and transparent consultations and communications between all stakeholders' (fishers, aboriginal groups, NGO's, managers and scientists).
- This fishery is well monitored through 100% dockside monitoring, at-sea-observer coverage (5-10% of landings) and mandatory VMS (Vessel Monitoring System) usage in most areas.

To reiterate, the primary objective of the above management measures and practices attempt to balance the stability processes operating on long-term (adaptability) and short-term (resilience) (see Choi and Patten 2001) in order to maintain the sustainability of the Snow Crab population as a whole and the fishery that is dependent upon it. It is, therefore, explicitly PA-compliant.

Even with these measures, knowledge of biological reference points for the targeted fraction of the population (mature males >95 mm CW) are required to guide annual TAC advice and related management measures. There is no 'correct' or 'best' choice of reference points, especially given the fact that the underlying carrying capacity is quite variable over time; recruitment has been episodic and the SSB remains protected. In other words, the 4VWX Snow Crab population is not at, nor near, any equilibrium state. As a result, the parameter estimates from the logistic model provide only first order estimates of the true biological reference points (see Methods).

# APPENDIX 3: STOCK ASSESSMENT MODEL

A modified discrete logistic model of the fishable biomass component is used to determine the relevant biological reference points (i.e., carrying capacity and  $F_{MSY}$ ) associated with the harvest control rules of the Snow Crab fishery. In the fishery literature, this model is commonly referred to as a surplus production or biomass dynamics model. The rationale for using a discrete logistic model is due to its minimal data requirements:

- ageing is currently not possible with Crustacea;
- complex life cycle results in high variability of maturity ogives, individual growth trajectories and spatially and temporally variable size and sex structure; and
- a reliable stock-recruitment relationship has not been demonstrated/established.

Arguing against the usage of any standard fishery model (including the discrete logistic model) is the fact that the fishable component (large males) is not the same as the spawning stock biomass (reproductive females). Due to sex-related differences in longevity, body size/growth, maturity ogives, habitat usage, predation risk and fishery exploitation, any such model would require a large number of assumptions to convert SSB to the fishable component.

Rather than attempting to make any such potentially untenable assumptions, we instead follow the more general formulation of the logistic model as a truncated Taylor series approximation of some constrained time series. For any general variable of state, B (e.g., fishable biomass), its time rate of change is, in general, some function  $\mathbf{F}$  of itself and a variety of other parameters  $\theta$ :

$$dB / dt = \mathbf{F}(B; \theta)$$

If we proceed with a Taylor series expansion of  $F(B=B^*; \theta)$  at some value  $B^*$ :

$$\mathbf{F}(B; \theta) = c_1 B + c_2 B^2 + c_3 B^3 + \dots;$$

where *c* are constants. And only polynomials of order 2 and lower are retained:

$$\mathbf{F}$$
 (B;  $\theta$ )  $\approx$  c<sub>1</sub>B + c<sub>2</sub> B<sup>2</sup>

And if we set  $c_1 = r$  and  $c_2 = -r/K$  and simplify, we obtain the basic form of the classical logistic model:

$$\mathbf{F}$$
 (B;  $\theta$ )  $\approx$  rB (1 – B/K)

With normalization by K, this simplifies further to:

$$\mathbf{F}$$
 (B;  $\theta$ )  $\approx$  rb (1 – b)

Which, in discrete form, becomes:

$$b_t - b_{t-1} \approx r b_{t-1} (1 - b_{t-1})$$

Removals of the fishable component by a fishery is commonly expressed as an additive term, *c*, the K-normalized catch:

$$\begin{aligned} b_t - b_{t-1} &\approx r \ b_{t-1} \ (1 - b_{t-1}) - c_{t-1} \\ b_t &\approx b_{t-1} + r \ b_{t-1} \ (1 - b_{t-1}) - c_{t-1} \end{aligned}$$

The intrinsic rate of increase, r, is therefore, some function **G** of growth, recruitment, natural mortality, handling mortality and/or incidental bycatch, etc., but excluding fishery catch, c:

Generally, r and K are assumed constants. These quantities, however, are not constant, especially given the systemic changes in the SSE associated with the collapse of groundfish in

the mid-1990s and the punctuated nature of its time dynamics. We will return to this issue below.

Nonlinear, Bayesian state space methods were used to estimate the parameters of this model,  $\theta$ . This is due to its greater numerical stability; ability to realistically propagate credible errors; ability to estimate unobserved states ("true" fishable biomass); and its ability to simultaneously estimate model "process" errors and data "observation" errors. Process errors ( $_{\rho}\sigma^{2}$ ) are the uncertainties that feed back into future states via error propagation: for example, via the recursive form of the logistic equation (i.e., errors in  $b_{t+1}$  in the state space of  $b_{t}$  vs  $b_{t+1}$ ). Observation errors ( $_{o}\sigma^{2}$ ) refer to the uncertainties associated with measurement and observation (i.e., measurement/data-related errors of both variables in the state space of  $b_{t}$  vs  $b_{t+1}$ ). This latter ability is particularly important as parameter estimates and forecasts based on observation-only errors provide unrealistically optimistic (small and constant) error bounds; and parameter estimates and forecasts based on process-only errors expand rapidly into the future, resulting in potentially unrealistically pessimistic (large and usually growing) error bounds.

The main distributional assumptions of the model of fishable biomass are as follows. The reader is referred to the code below for the distributional assumptions and derivations of each of the specific priors.

As the fishable biomass of Snow Crab follows a lognormal distribution, a multiplicative observation error model was assumed, with a variance  $\sigma^2_{t,o}$ . The observed fishable biomass index  $O_t$  was assumed to be linearly related to the "true" unobserved fishable biomass by a proportionality constant q such that  $O_t = q \ K \ b_t$  for each of the three separate CFAs, denoted by a:

$$O_{t,a} \sim Lognormal (log(q_a K_a b_{t,a}), o\sigma_a^2)$$

The "~" indicates "is distributed as", which in this case is a lognormal distribution with mean  $log(q_a \ K_a \ b_{t,a})$  and variance  ${}_o\sigma^2{}_a$ . The prior on the observation error,  ${}_o\sigma^2{}_a$ , was assumed to be minimally informative and diffuse, following a half-Cauchy distribution with center of mass in the interval (0,1), parameterized with location 0 and scale 0.5.

Catchability, *q*, is a factor that simplistically quantifies the influence of a number of differing biases, including survey gear, survey protocols, areal expansion protocols, survey stratification and statistical modeling, etc. It is overly simplistic as such biases are non-constant over time and space. However, here, it serves as a first-order estimate of such influences. Historically, it was assumed to be 1 due to the nature of the sampling design and analytical methodology. For modeling purposes, it is separated into two components for each of spring (pre-2004) and summer (post-2004) surveys with a Gaussian prior with a mean of 1 and a standard deviation of 0.25:

$$q_a \sim Normal (1, 0.25)$$

Process error was assumed to follow a (multiplicative) lognormal distribution with variance  $p\sigma^2$  whose prior was similar to the observation error, assumed to follow a half-Cauchy distribution with center of mass in the interval (0,1), parameterized with location 0 and scale 0.5.

Normalized catch, c, was assumed to be known without error:

$$b_{t,a} \sim \text{Lognormal} \left( \log(b_{t-1,a} + r_{t-1,a} b_{t-1,a} (1 - b_{t-1,a}) - c_{t-1,a}), p\sigma^2 \right)$$

and a starting biomass that followed a Beta distribution shifted to the right:

$$b_{0,a} \sim Beta (8, 2).$$

Carrying capacity was assumed to follow a log-normal distribution:

```
K_a \sim Lognormal (\kappa \mu_a, \kappa \sigma^2_a)
```

Where the area specific  $\kappa\mu_a$  and  $\kappa\sigma^2_a$  were chosen based on previous knowledge of the production in the area and were set to means of ln(1.83), ln(4.17) and ln(0.78) for N-ENS, S-ENS and 4X, respectively, and standard deviations that corresponded to a 25% coefficient of variation. The intrinsic rate of increase was assumed to be stationary with a prior of

```
r_a \sim Normal (0.96, 0.25)
```

These priors were marginally informative. For carrying capacity, the distribution was assumed to be bounded to be within previously estimated historical maxima. For the intrinsic rate of increase, the distribution was chosen to center on ~1. This is loosely based upon estimates of  $_{r}\mu \approx 1$  for crab of similar longevity and body size, *Cancer pagurus* in Europe (Laurans and Smith 2007). The posterior distribution of the parameters of interest,  $\theta$ , conditional upon the data were estimated via MCMC (NUTS) sampling using the STAN platform (STAN 2015). Four Markov chains were followed to ensure convergence and mixing; 2,000 simulations in the burn-in phase were sufficient to ensure such convergence of the Markov chains. Another 8,000 simulations were used to describe the posterior distributions of the parameters.

The Stan model used for parameter estimation is as follows:

```
data {
        int<lower=0> N; // no. years
        int<lower=0> U; // no. regions
        int<lower=0> M; // no. years to project
        int ty;
        real er ;
        real eps ;
        vector[U] Ksd;
        vector[U] rsd;
        vector[U] qsd;
        vector[U] Kmu ;
        vector[U] rmu ;
        vector[U] qmu ;
        matrix[N,U] CAT;
        matrix[N,U] IOA;
        matrix[N,U] missing;
        int missing_n[U];
        int missing_ntot;
      transformed data {
        int MN;
        int N1;
        MN = M+N;
        N1 = N+1;
      parameters {
        vector <lower=eps>[U] K;
        vector <lower=eps,upper=3>[U] r;
        vector <lower=eps,upper=2>[U] q;
        vector <lower=eps,upper=2>[U] qs;
        vector <lower=eps,upper=(1-eps)>[U] bosd; // observation error
        vector <lower=eps,upper=(1-eps)>[U] bpsd; // process error
        vector <lower=eps,upper=(1-eps)>[U] b0;
        vector <lower=eps>[missing_ntot] IOAmissing;
        matrix <lower=eps>[M+N,U] bm;
      transformed parameters {
        matrix[N,U] Y; // index of abundance
        {\tt matrix[N,U]} Ymu; // collator used to force positive values for lognormal
        matrix[MN,U] bmmu; // collator used to force positive values for lognormal
matrix[MN,U] rem; // observed catch
```

```
// copy parameters to a new variable (Y) with imputed missing values
          int ii;
          ii = 0;
          for (j in 1:U) {
            for (i in 1:N) {
               Y[i,j] = IOA[i,j];
               if ( missing[i,j] == 1 ) {
                 ii = ii+1;
                 Y[i,j] = IOAmissing[ii];
               }
            }
          }
        }
        // removals (catch) observation model, standardized to K (assuming no errors in observation of
catch!)
        for (j in 1:U) {
          rem[1:N,j] = CAT[1:N,j]/K[j];
rem[(N+1):MN,j] = er*bm[ N:(MN-1),j]; // forecasts
        // -----
        // observation model calcs and contraints:
        // Ymu = 'surveyed/observed' residual biomass at time of survey (Bsurveyed)
        // cfanorth(1) and cfasouth(2)
             This is slightly complicated because a fall / spring survey correction is required:
        //
        //
             B represents the total fishable biomass available in fishing year y
                in fall surveys: Btot(t) = Bsurveyed(t) + removals(t)
        //
        //
                in spring surveys: Btot(t) = Bsurveyed(t) + removals(t-1)
        // spring surveys from 1998 to 2003
             this is conceptualized in the following time line:
        //
                '|' == start/end of each new fishing year
        //
                Sf = Survey in fall
        //
                Ss = Survey in spring
        //
                |...(t-2)...|.Ss..(t-1)...|(t=2004)..Sf.|...(t+1).Sf..|...(t+2)..Sf.|...
        // Cfa 4X -- fall/winter fishery
        // assume similar to a spring fishery but no need for separate {\bf q}\mbox{'s}
               Btot(t) = Bsurveyed(t) + removals(t-1)
        //
               NOTE: year designation in 4X is for the terminal year: ie. 2001-2002 => 2002
        for (j in 1:2) {
          Ymu[1,j]
                           = qs[j] * bm[1,j] - rem[1,j] ; // starting year approximation
          Ymu[2:(ty-1),j] = qs[j] * bm[2:(ty-1),j] - rem[1:(ty-2),j] ; //spring surveys
                           = q[j] * bm[ty,j] - (rem[(ty-1),j] + rem[ty,j])/2.0; //transition year ...
          Ymu[ty,j]
approximation
          Ymu[(ty+1):N,j] = q[j] * bm[(ty+1):N,j] - rem[(ty+1):N,j]; // fall surveys
          int k;
          k=3;
                          = qs[k] * bm[1,k] - rem[1,k] ; // starting year approximation
          Ymu[1,k]
           \begin{array}{lll} \text{Ymu[2:(ty-1),k]} &=& qs[k] * bm[2:(ty-1),k] - rem[1:(ty-2),k]; \\ \text{Ymu[ty:N,k]} &=& q[k] * bm[ty:N,k] - rem[(ty-1):(N-1),k]; \\ \end{array} 
          for (j in 1:U) {
          for (i in 1:N) {
            Ymu[i,j] = K[j] * fmax( Ymu[i,j], eps); // force positive value
        // process model calcs and constraints
        for (j in 1:U) {
          bmmu[1,j] = b0[j]; // biomass at first year
          for (i in 2:MN) {
            bmmu[i,j] = bm[i-1,j] * (1.0 + r[j]*(1-bm[i-1,j])) - rem[i-1,j];
```

```
}
    for (j in 1:U) {
     for (i in 1:MN) {
       bmmu[i,j] = fmax(bmmu[i,j], eps); // force positive value
   }
 }
 model {
   // ---
    // priors for parameters
   K ~ normal( Kmu, Ksd ) ;
   r ~ normal( rmu, rsd )
   q ~ normal( qmu, qsd ) ;
   qs ~ normal( qmu, qsd ) ;
   b0 ~ beta(8,2); // starting b prior to first catch event
bosd ~ cauchy(0,0.5); // slightly informative .. center of mass between (0,1)
   bpsd ~ cauchy( 0, 0.5 );
   // -----
    // biomass observation model
   for (j in 1:U) {
     log(Y[1:N,j]) \sim normal(log(Ymu[1:N,j]), bosd[j]);
      // stan thinks Y is being transformed due to attempt to impute missing values .. ignore
    // -----
    // biomass process model
   for (j in 1:U) {
      log(bm[1:MN,j]) \sim normal(log(bmmu[1:MN,j]), bpsd[j]);
    // could have used lognormal but this parameterization is 10X faster and more stable
   target += - log(fabs(Y)); // required due to log transf above
   target += - log(fabs(bm));
}
```

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