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Modeling connectivity of walleye pollock in the Gulf of Alaska: Are there any linkages to the Bering Sea and Aleutian Islands?

by

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Abstract

We investigated the connectivity of walleye pollock in the Gulf of Alaska (GOA) and linkages to the Bering Sea (BS) and Aleutian Island (AL) regions. We used a spatially-explicit Individualbased model (IBM) coupled to 6 years of a hydrodynamic model that simulates the early life history of walleye pollock in the GOA (eggs to age-0 juveniles). The processes modeled included growth, movement, mortality, feeding and the bioenergetics component for larvae and juveniles. Simulations were set to release particles on the 1st of the month (February to May) in fourteen historical spawning areas in the GOA up to the 1st of September each year. Model results reproduced the link between the Shelikof Strait spawning area and the Shumagin nursery region for March and April spawners, besides other Potential Nursery Areas (PNAs) found in the GOA. A prominent finding of this study was the appearance of the BS as important PNAs for several GOA spawning grounds, which is supported by a consistent flow into the BS through Unimak Pass. The simulations showed the highest density of simulated surviving pollock in the western Bering Sea (WBS) region with the lowest coefficients of variation of the whole domain. Three spawning sectors were defined, which aggregate multiple spawning areas in the eastern (EGOA), central (CGOA) and western Gulf of Alaska (WGOA). A connectivity matrix showed strong retention within the CGOA (25.9%) and EGOA (23.8%), but not in the WGOA (7.2%). Within the GOA, the highest connectivity is observed from EGOA to CGOA (57.8%) followed by the connection from CGOA to WGOA (24.3%). Overall, one of the most prominent connections was from WGOA to WBS (62.8%), followed by a connection from CGOA to WBS (29.2%). In addition, scenarios of shifting spawning locations and nursery sectors of GOA, BS and AL are explored and implications for walleye pollock stock structure hypotheses are discussed.

1. Introduction

Walleye pollock (Gadus chalcogrammus) is a dominant component of the Gulf of Alaska (GOA) ecosystem, but knowledge of the biological and physical mechanisms that create variability in its recruitment is incomplete. Peak spawning at the major spawning areas in GOA occurs at different times. Adult walleye pollock are known to spawn from late March to early April at the southwestern end of Shelikof Strait, between Kodiak Island and mainland Alaska (Kendall et al., 1987; Schumacher and Kendall, 1991). Eggs are fertilized at depths between 150 and 200 m, and hatch after a period of about two weeks (Yoklavich and Bailey, 1990). These larvae rise to the upper 50 m of the water column and drift in prevailing currents for the next several weeks (late April through mid-May) (Yoklavich and Bailey, 1990). Larger larvae undergo diel migrations between 15 and 50 m (Kendall et al., 1994). Currents transport larvae southwest along the Alaska Peninsula (Fig.1), or offshore along the shoreward edge of the Shelikof sea valley southwest of Shelikof Strait (Yoklavich and Bailey, 1990; Hinckley et al., 2001). By mid-summer, many of the survivors (juvenile stage) have been advected to the Shumagin Islands, about 300 km southwest of the Shelikof spawning site (Hinckley et al., 1991). The prevailing hypothesis is that Shelikof Strait is the primary spawning area, and that the Shumagin Islands provide the main nursery area in the GOA (Hinckley et al., 2001). Another apparent spawning peak occurs between February 15 to March 1 in the Shumagin Islands area and surrounding areas, (Dorn et al., 2012). These secondary walleye pollock spawning areas have been observed in the GOA during acoustic surveys. The shelf break near Chirikof Island, the Shumagin area, Sanak Gully, Morzhovoi Bay and Marmot Bay (Fig. 1) satisfy the criterion of appearing in the acoustic surveys at least three times to be considered secondary spawning regions (Dorn et al., 2014). In addition, egg distribution data from ichthyoplankton surveys conducted by the Alaska Fisheries Science Center (AFSC, Ciannelli et al., 2007) have shown non-Shelikof spawning locations (Unimak Pass, Semidis and Shumagin Islands, Fig.1; Ciannelli et al., 2007). However, the role of these non-Shelikof spawning areas and their contribution to the GOA pollock stock remains uncertain.

GOA walleye pollock is currently managed as a single stock, independent of Bering Sea (BS) and Aleutian Islands (AL) walleye pollock. Within the GOA, there is evidence that distinguish (e.g. allozyme frequency and mtDNA) the Shelikof Strait spawning population from spawning populations in the northern GOA (Prince William Sound and Middleton Island), although some interannual genetic variability has been observed (Olsen et al., 2002). Despite this variability, evidence provided from the assessment of the stock structure following the template developed by the North Pacific Fishery Management Council) stock structure working group (Dorn et al., 2012) supports treating pollock in the eastern portion of the GOA separately from pollock in the central and western portions. Separation of walleye pollock in the GOA from those in the Eastern Bering Sea (EBS) is based on studies of larval drift from spawning locations (Bailey et al., 1997) and genetic studies based on allozyme frequencies (Grant and Utter 1980; Olsen et al. 2002), mtDNA variability (Mulligan et al., 1992; Shields and Gust 1995; Kim et al., 2000), and microsatellite allele variability (O'Reilly et al., 2004). Dorn et al. (2012) claim that results supporting the current separation of walleye pollock stocks in the GOA are equivocal, since the data used for the larval transport study (Bailey et al., 1997) did not encompass the entire range of the GOA, and genetic analyses have not provided definitive results on the separation or mixing of population components. However, examining how distributions of fish evolve between adult spawning locations and juvenile retention areas, may contribute to the understanding of early stage growth and survival, the connection between spawning and nursery areas, and population structure.

Population connectivity is inherently a coupled bio-physical research topic, involving physical processes such as jets, eddies, meanders, fronts, tides, island wakes and lateral intrusions (Cowen

and Spounagle, 2009). However, physical processes alone do not determine connectivity, because larval behavior such as vertical migration also plays a relevant role (Cowen *et al.*, 2002). A connectivity matrix describes the spatial distribution of settlement destinations or nursery grounds of individuals that originate from a given source, as well as the links between both regions (Largier, 2003). The quantification of the probability of larvae reaching nursery areas, through transport, given specific spawning grounds determines the strength of the connectivity. Almost all fish have planktonic life stages that can spend days, weeks, or months drifting, eating, and growing in the pelagic zone (Gaines *et al.*, 2007). Scales of dispersal can vary by more than six orders of magnitude, ranging from meters to hundreds of kilometers (Cowen *et al.*, 2000; Gaines *et al.*, 2007; Pineda *et al.*, 2007). In regions with complex circulation patterns, trajectories of individual fish may differ widely, resulting in a wide range of exposures to environmental variables such as temperature, salinity, and to predator and prey interactions, resulting in variable growth and survival among individual larvae.

Connectivity can be estimated by tracking individuals (Largier, 2003). However, there are nontrivial logistic and operational constraints when tracking small aquatic organisms over hundreds of kilometers (Willis *et al.*, 2003; Sale *et al.*, 2005). Computer simulation models have therefore been used to increase the understanding of the kinematics of early life stages of several fish species, but the dispersal, survival, and connectivity between spawning and nursery areas remains unresolved for many marine populations (Beck *et al.*, 2001; Cowen *et al.*, 2007). Lagrangianbased, spatially-explicit Individual-Based Models (IBMs) can be used to track individuals from their release at spawning sites to nursery areas, and have been used in connectivity studies (e.g. Werner *et al.*, 2001, North *et al.*, 2009). Previous IBM models have explored the early life history of walleye pollock in the GOA (Hinckley *et al.*, 1996; Hinckley *et al.*, 2001; Megrey and Hinckley, 2001) by studying the impact of physical and biological factors on location timing of spawning for this species, and recruitment variability and the resulting spatial distributions.

In this study we used a spatially-explicit IBM – hydrodynamic coupled model to reveal early life stage (i.e. egg to age-0 juvenile) walleye pollock trajectories between spawning areas within the GOA and nursery areas in the GOA, BS, and AL region. The primary objective was to determine the relative importance of spawning times and locations to surviving age-0 walleye pollock juveniles in nursery areas during the fall of each year. In addition, scenarios of connectivity between spawning locations and recruitment of GOA, BS, and Al populations and implication for walleye pollock stock structure hypotheses are discussed.

2. Methods

The modeling approach consisted of the development of a biophysical model in which the Regional Ocean Modeling System (ROMS) is coupled with a modified version of the IBM for walleye pollock developed by Hinckley *et al* (1996) and Megrey and Hinckley (2001). The details of the biological model configuration and additions are briefly summarized in section 2.3.

We coupled ROMS outputs to a young walleye pollock IBM, modified from Hinckley *et al.* (2008). The hydrodynamic model produced daily averaged output consisting of salinity and temperature fields, and 3D velocities. These physical variables were used to drive the IBM model over the same years (1978, 1982, 1988, 1992, 1999, 2001). The IBM operates on the same spatial grid as the hydrodynamic model (see below).

2.1 Hydrodynamic model configuration

The hydrodynamic model used in this work is the fourth generation of the Northeast Pacific model (NEP4) previously described by Curchitser *et al.* (2005), Hermann *et al.* (2009 a,b), and Cooper *et al.* (2013). This model has been used to examine the drift and transport of a variety of North Pacific marine species including Greenland halibut (Duffy-Anderson *et al.*, 2013). It is based on the ROMS (Shchepetkin and McWilliams, 2005; Haidvogel *et al.*, 2008) coupled with a sea ice component (Danielson *et al.*, 2011). Tidal dynamics are not included in this version of the NEP model; hence tidally-forced mixing on the shelves and in the Aleutian passes is not resolved. The model domain spans 20°N to 71°N and extends approximately 2,250km offshore from the North American coast. The horizontal resolution is ~10km resulting in 212x572 grid points. There are 42 vertical levels (s-coordinate), refined for tighter spacing near the surface; these span the instantaneous thickness of water column from the sea floor to the sea surface.

The baroclinic Rossby radius in the GOA and the BS is generally smaller than 20 km (e.g. Chelton *et al.* 1998). The 10 km spatial grid and lack of tidal mixing in this modeling study are both expected to limit the resolution and/or strength of some flow features (e.g. tidal residuals, shelf-break fronts, and mesoscale eddies smaller than ~50 km), and hence to underestimate the full value of larval dispersal. Despite these limitations, we note that: 1) recent global modeling studies at ~10 km resolution without tides have still achieved very realistic results for features such as sea ice in the BS (e.g. Li *et al.* 2015a,b); and 2) a model sensitivity study of the GOA (Hermann *et al.*, 2002) found that tidal information exerted a significant influence on sub-tidal scalar and velocity structure only in specific shallow areas, where the tides (and tidal mixing) are strongest. Methods used to explicitly assess our regional model's ability to hindcast observed velocities and the years selected from the hidrodynamic model are described in section 2.2.

A multi-decadal (1958-2004) simulation of currents and temperatures was conducted by E. Curchitser and K. Hedstrom (pers. comm.). Oceanic surface boundary conditions were derived from a hindcast simulation using the Community Climate System Model (CCSM; Collins et al., 2006) version of the Parallel Ocean Program (POP; Smith and Gent, 2002). Daily surface forcing functions (at $2^{\circ} \times 2^{\circ}$ resolution) were obtained from the Common Ocean-Ice Reference Experiments Large Yeager (2004,2008. of and at http://data1.gfdl.noaa.gov/nomads/forms/mom4/COREv2.html), which consists of 6-hourly winds, air temperatures, sea level pressure and specific humidity, daily short-wave and downwelling long-wave radiation, and precipitation. Surface fluxes of heat and momentum were calculated from the atmospheric data using bulk formulae (Fairall et al., 1996), which include the instantaneous model sea surface temperature (SST). Freshwater runoff was applied at the coast based on spatially distributed runoff time series (T. Royer, pers. comm.) and USGS data. The oceanic surface boundary layer is computed using the K-profile parameterization (Large et al., 1994). The geographical northern boundary has a sink term that enforces a 0.8 Sv northward transport through the Bering Strait (Roach et al., 1995). Daily averages of modeled fields at 10 km resolution were archived for use in our analyses. The use of CORE atmospheric forcing excludes finer-scale atmospheric phenomena, such as those produced by local orography, in the GOA. Past sensitivity experiments using measured oceanic flux through Shelikof Strait demonstrated how increasing the resolution of the forcing winds was of limited consequence, as compared to the effect of increasing the resolution of the oceanic model itself (Hermann et al., 2009a). That is, many of the finer-scale ocean phenomena (e.g. observed daily flux through that narrow strait) are still reproduced adequately with the $2^{\circ} \times 2^{\circ}$ resolution CORE atmospheric forcing, provided the oceanic model resolution is sufficiently fine. As demonstrated below, the use of CORE winds was adequate to capture flows through Unimak Pass, a major element of this study.

2.2 Hydrodynamic model scenarios and performance

Six runs of the hydrodynamic model were selected to be coupled with the modified IBM as indicated above.. The selection of years encompassed three years before (1978, 1982, 1988) and three years after (1992, 1999, 2001) the shift in control of recruitment dynamics of walleve pollock in the GOA characterized by an increase of juvenile pollock mortality due to a gradual build-up of groundfish predators during the mid- and late-1980s (Bailey, 2000). An IBM was run independently of the ROMS. Details of the physical model simulations and the assessment of the model's ability to reproduce observed variability and their impact in the northeast Pacific can be found in Curchitser et al. (2005). In addition, in this study we add some specific analysis focused in the GOA and BS to strengthen the validation within the domain of interest. Drifter data were used to explore the hydrodynamic model performance. Starting in 1986, the Alaska Fisheries Science Center (AFSC, NOAA) and Pacific Marine Environmental Laboratory (PMEL) have deployed numerous (~200) free-floating satellite-tracked Lagrangian drifters in the North Pacific drogued Ocean and the BS. These are at 25 to 40 m depth (http://www.ecofoci.noaa.gov/drifters/efoci_driftersIntro.shtml) to avoid the effect of wind on drifter movements. Our basic methodology for use of drifter data is similar to that described in Stabeno and Reed (1994). Data were readily available for years 1986-2006; hourly changes in drifter position were used to calculate the local velocity. Climatological average velocities were then derived from the drifter measurements. Model climatology was derived using 1986-2004 results of the CORE-forced hindcast. Both model and drifter data from May 15 - Oct 15 of each year were binned using the same, regular $0.5^{\circ} \ge 0.5^{\circ}$ latitude-longitude grid. From the data, only those bins with a total of at least 200 hourly drifter observations were retained for comparison (note that this can be from a single drifter over 200 hours or many drifters over shorter periods). Further, only those locations shallower than 200 m were compared; observations were too sparse beyond the shelf break to obtain stable mean values at the 0.5° x 0.5° resolution, due to intermittent shelf-break eddies in both model and data. Finally, using bins containing both model and data estimates, the correlation of modeled vs. observed climatological velocities was calculated separately for u and v. This approach (validation of climatological currents using bins larger than the ROMS grid itself) is intended to demonstrate the overall performance of the NEP4 model, averaged over many synoptic-scale events (storms and eddies), and covering a broad area. Pointwise validation of closely related NEP3 and NEP5 simulations has been conducted using sea surface height data (Hermann et al., 2009a), as well as moored current meters and temperature profiles (Hermann et al., 2013).

Besides model performance and model coupling, the hydrodynamic model output was used to study current patterns and transport along the domain. Some focus was put on exploring the current patterns between the GOA and BS through Unimak Pass in order to understand the connection and seasonality of the flow between both systems. Therefore, monthly mean values of the flow intensity and direction between the GOA and BS were examined. Velocities at 40 m depth were extracted from the NEP4 output, spatially averaged across Unimak Pass, and time-averaged by month for this purpose.

2.3. Individual-based model, parameters, and mechanisms

The IBM considers four life stages between spawning and the juvenile stage: the egg stage, the yolk-sac larval stage, the feeding larval stage, and the age-0 juvenile stage (Hinckley *et al.*, 1996;

Megrey and Hinckley, 2001). Modeled processes such as growth, movement, mortality, feeding rate of larvae and bioenergetics are based on a wide variety of field and laboratory observations on this population. Egg development was driven by age and temperature (Blood et al., 1994). Growth of yolk-sac larvae depends on degree days, and a feeding probability is calculated to determine when larvae enter the feeding stage. The growth of feeding larvae depends on consumption estimated as a function of individual weight and temperature (Hinckley et al., 1996) and a bioenergetic model based on assimilation efficiency (Houde, 1989) and daily respiration rate (Yamashita and Bailey, 1989). A feeding model was also developed for juvenile pollock. This model was based on field data showing prey preference depending on juvenile walleve pollock size (M. Wilson, AFSC, Seattle, pers. comm), with an increasing shift to euphausids from copepods as juvenile fish grew. Prey availability was assumed to be constant (except where estimates were available, see below), but proportions of each type (small and large copepods, euphausids) in each area were based on historical data (M. Wilson, AFSC, Seattle, pers. comm., NPRB Project 308 Final Report). In the inner shelf areas, the density of euphausids, small copepods, and large copepods were higher $(1.17838, 486.2773, 66.66362 \text{ number m}^{-3})$. In the mid and outer shelf and slope areas, prey densities started low (number of euphausids, small and large copepods were 0.294595, 121.56933, 16.665905 number m-3) up to Day of the Year (DOY) 120 and then increased up to DOY 160 (mid-June) to the values for the inner shelf; based on Nitrogen Phytoplankton Zooplankton model output for several years (Hinckley, 1999). Prey was set to 0 at depths >1000m (i.e. off the continental shelf). Prey consumption of juveniles was estimated using a model based on Bevelhimer and Adams (1993), Stockwell and Johnson (1997), and Stockwell and Johnson (1999). A bioenergetic model for juveniles was implemented based on Ciannelli et al. (1998). The digestion model implemented was based on Elliot and Pearson (1978) and uses evacuation rates for juvenile pollock (Merati and Brodeur, 1996; Mazur et al. 2007). The vertical position algorithm is stage-dependent as in Hinckley et al. (1996). Egg terminal velocity was calculated based on Sundby (1983). Yolk-sac larvae stay at hatching depth until first-feeding. Feeding larvae rise to the upper water column. At 6 mm larvae begin a type-II vertical migration (morning descent and evening ascent) with swimming speeds dependent on larval lengths. Vertical movement of juveniles is based on the calculation of a vertical mean velocity that depended on juvenile length (Hurst, 2007). A correlated random walk algorithm was added to simulate horizontal movement of juveniles (Kareiva and Shigesada, 1983). This algorithm develops a procedure to simulate movement paths as a sequence of straight lines in which juvenile displacement depended on size class. The position of the juvenile at each time step depended on the position in the previous time step, the length of the juvenile and the turning angle at each time step. Eggs, yolk-sac larvae, feeding larvae, and juveniles survival is a decreasing exponential function dependent on the instantaneous daily mortality rate at each stage (Hinckley et al., this issue). Groundfish predation on 0-age juveniles was added to the juvenile subroutine. Predation index was based on 8 years of groundfish predation data (K. Aydin, Alaska Fisheries Science Center, Seattle, WA, pers. Comm.). The predation index in a given year was estimated based on the consumption rate of a given predator, the estimated total biomas of the predator, and the proportion of young pollock in the diet of the predators. (Holsman and Aydin, 2015). The assumption was that the mean predation rate of 0.3 day-1 was adjusted to the mean index value and used for years when no data were available. A superindividual scheme (Scheffer et al., 1995; Megrey and Hinckley, 2001; Bartsch and Coombs, 2004) was added. This approach uses realistic mortality rates in IBMs by increasing the number of individuals represented by each point or float (i.e. superindividual) without greatly increasing computational times. Each particle is a superindividual that experiences mortality as the particles are tracked in time and space (Scheffer et al., 1995; Megrey and Hinckley, 2001). In addition, other function added was the UNESCO equation for the estimation of seawater density based on salinity and temperature. This replaced the previous salinity linear function (Hinckley *et al.*, 1996). This results in a generic model that more accurately captures seasonal changes in density. Model details and additions can be found in Hinckley *et al.* (this issue).

2.4 Spawning simulation conditions and nursery locations

Six years of the hydrodynamic model were used to accommodate interannual variability (i.e. pre and post shift in the recuritment control dynamics of pollock, cold/warm, El Niño/La Niña years) in the IBM (3 years pre and 3 years post shift) analysis to have sufficient simulation scenarios to test the spawning conditions, infer Potential Nursery Areas (PNAs), and assess retention and connectivity indices. The model domain was subdivided into 45 areas according to bathymetry and topography (islands, sounds, passes, bays, straits) to define initial spawning regions for walleye pollock, and to identify PNAs (Fig. 1). Fourteen initial areas for particle release were selected in the Eastern (ECOA), Central (CGOA), and Western Gulf of Alaska (WGOA) (white circles, Fig.1), which covered the bulk of known pollock spawning areas in the GOA (Table 1). These areas were inferred from historical data (Kendall et al., 1996; Matarese et al., 2003, Bailey et al., 2005), surveys of pollock egg distribution (EcoFOCI ichthyoplankton database), acoustic surveys of pollock biomass, and biological information associated with stomach contents and forage fish (Rodrigues et al., 2006). Given that temporal and spatial coverage of pollock egg data varied among sampling years, a historical distribution of eggs was used to define spawning grounds. This spatial distribution is consistent with the temporal integration of the recent early life retrospective analysis (fortnightly egg walleye pollock distribution) by Doyle et al., (this issue). Eggs were released on the 1st of each of 4 months (Feb, Mar, Apr, May) in fourteen areas (5000 in each) identified as potential spawning areas. The value of the superindividual of each egg released was proportional to the egg production estimates from the stock assessments for pollock (Dorn et al., 2005). A series of simulations based on life stage specific submodels where performed with varying spawning locations and timing, and years of the simulation to examine potential spatio-temporal variability in the simulated number of surviving juveniles from spawning locations. PNAs are defined as the areas of accumulation of age-0 juvenile that contain survivors at the end of the simulation. Simulated PNAs were compared with the regions where juveniles have been sampled in FOCI surveys or during NMFS acoustic surveys of the walleye pollock biomass (Table 1). In addition, the spatial distribution of the PNAs (mean surviving juvenile pollock) and the coefficient of variation (ratio of the standard deviation to the mean) were calculated to identify regions of high and low variability. Virtual individuals were tracked through space and time using a Java-based float tracking application (Lett et al., 2008) that uses ROMS output to compute movements. At each time step the biological submodels are resolved and individual biological properties are updated (stage, length, survival state, depth, individual vertical and horizontal velocities, horizontal position), which determine the estimates of individual movement. These diverge considerable from passive drifters and affect the calculation of retention and connectivity indices.

2.5 Retention and Connectivity matrices

Retention and connectivity indices were calculated at the end of the simulation. *Retention was* defined as the proportion of eggs released in a particular spawning area that on the 1st of September was still in the same area. *Connectivity* is the dynamic interaction between geographically separated spawning and nursery areas via the combined effect of individual movement and currents on transport. Connectivity matrices are built based on the proportions of 0-age juveniles found on September 1st in a specific nursery area that come from each spawning

ground. Given the complexity of the connectivity matrices and varying factors, the connectivity matrices among 45 PNAs were aggregated, after the simulation, into broader 'sectors' (Fig.1) to simplify the model output interpretation. Note that lumping spawning areas before the model simulations would result in a loss in spatial resolution impacting transport patterns, connectivity, retention and subsequent interpretations. To summarize connectivity patterns, results were aggregated by three spawning sectors (EGOA, CGOA and WGOA) and eight nursery sectors (EGOA, CGOA, WGOA, AL, EBS, WBS, Arctic (AR) and the GOA Basin (BAS)).

3. Results and discussion

3.1 Hydrodynamic model performance

Model runs from ROMS NEP4 were analyzed and compared with velocities inferred from drift data. Specifically, modeled currents integrated between 15 May and 15 of October for the modeled years (1986 to 2004) were compared with Eulerian velocities generated through the spatial discretization of satellite drifter data released in the GOA and BS for the same period (Fig. 2). Although model and data do not have the same coverage, the data partially cover the CGOA, WGOA, BS Middle (Areas 30, 34 and 38; Fig. 1) and Outer (Areas 31, 35 and 39; Fig.1) domains. Overall, the intensity and the direction of the modeled currents are consistent with the intensity and direction of the observed currents. A scatterplot comparing measured and modeled u and v velocities shows good agreement between simulated and observed velocity components (Fig.3) with coefficients of determination (R^2) of 0.5 for the u-component and 0.63 for the v component. Detailed evaluation of the hydrodynamic model used in this study is presented in Curchitser et al. (2010), Danielson et al. (2011), and Cheng et al. (2014). The consensus was that sea ice cover was generally well represented in the model for the Bering Sea, and model kinetic energy was similar to empirical observations at frequencies lower than three days and at tidal frequencies. Sampled transects from model output showed that the model reproduced seasonal water column transitions from a well-mixed shelf regime, to a highly stratified two-layer system during the summer at the mid-shelf. The near-shore remained well mixed throughout the year in the empirical data and in the model results, with energy for mixing supplied from both wind and tide forcing. In addition, characteristic oceanographic features of the GOA and the BS (Stabeno and Reed, 1994; Stabeno et al. 2004) are observed in the modeled time-averaged velocities (March through September) for the years of the simulation (Fig.A1 appendix). Modeled velocities on the shelf exhibit a southwest current along the Alaska Peninsula toward the AL. Low current intensities (<0.04 m/s) are observed in Cook Inlet, Prince William Sound, north, south and west of Kodiak Island, in bays along the Alaska Peninsula, and in the Shumagin Islands region (Fig.1). Eddies are produced beyond the shelf break in the Alaskan Stream (e.g. note deformation of the Alaskan Stream around an eddy at 57°N, 150°W in Fig. A1(a) appendix). A consistent flow into the BS through Unimak Pass and other Aleutian passes is showed in the simulations (Fig.A1 appendix). The average monthly flow through Unimak Pass calculated for the first 40 m showed a consistent flow from the GOA through Unimak Pass to the BS in all years of the simulation (Fig.4). The climatological mean over all simulation years shows that the flow through Unimak Pass to the BS intensifies from September to January of the following year, decaying toward August. However, interannual variability is high. The speeds and seasonal pattern correspond to the measurements of Stabeno et al. (2002). The modeled flow between March and September from the CGOA and towards the AL is consistent with that observed in binned, time-integrated velocities. Potential limitations of this model compared to other recent ocean model configurations (Dobbins et al., 2009; Coyle et al., 2012; Gibson et al., 2013) have been raised by Hinckley et al. (this issue).

3.2 Biophysical model performance and known nursery areas in GOA

The coupled biophysical IBM was used to examine connections between potential spawning and nursery areas, and how the relative strength of these connections varied over the spawning season. Historically, the majority of pollock spawning in the GOA occurred from mid-March to early May in Shelikof Strait (Fig. 1, Kendall et al., 1987; Schumacher and Kendall, 1991), with peak spawning at the start of April in the deepest part of Shelikof Strait. After spawning, eggs and larvae are advected southwest by the Alaska Coastal Current along the Alaska Peninsula and arrive in the Shumagin Islands 8 to 10 weeks later. Eggs and larvae may also be advected into the Alaskan Stream, where they can be lost from the population (Bailey et al., 1999). The Shumagin Islands region has traditionally been considered the nursery area that ensures the success of the population in the GOA (Hinckley et al., 1991, Wilson et al., 1996). Our results showed a high mean density of surviving (simulated) juvenile pollock (integrated over years) occurring primarily in the Shumagin Islands area (Fig.5a corresponding to areas 17 and 18; see Fig.1) which presented the lowest coefficient of variation (Fig.5b). In addition, model results confirmed a strong link between the Shelikof Strait spawning area and the Shumagin nursery region with 40-45% connectivity for March spawners and 45-50% for April spawners (Fig.A2 appendix). Model simulations demonstrated that destinations of surviving age-0 walleye pollock agreed with the observed nursery area, which extends from the Semidi Islands to Unimak Pass (Brodeur and Wilson, 1996; Wilson et al., 1996; Wilson, 2000). Additional observations of juveniles near the coast of the Alaska Peninsula inshore of Shumagin Island (Hinckley et al., 1991; Brodeur et al., 1995; Wilson et al., 1996; Hinckley et al., this issue) support this claim. Other simulated PNAs included the Semidi Islands (SemI), coastal Aleutian Islands (UI and UIof) and northeast of Kodiak Island (Oc, Kin and KIS) (Fig.5a), which are consistent with known or suspected nursery regions described in the literature (Table 1). Supporting evidence for the importance of the Semidi Islands as a juvenile walleye pollock nursery area is derived from a spatial bioenergetics model for the western GOA, which indicated that habitat conducive to juvenile walleye pollock growth was located along the eastern edge of Semidi Bank, in the vicinity of Castle Cape, Kupreanof Point, and south-west of Sutwik Island (Fig.1, Mazur et al., 2007). Fish spawned in the North Kodiak area were transported to the southwest GOA, to the BS, and to the AL regions. A potential caveat to this result is that juvenile fish found in bays around northern and eastern Kodiak Island (Wilson et al., 1996) may have been spawned on the continental shelf near Kodiak Island, and may exhibit behavior and directed swimming not modeled in the IBM. The ROMS, which uses a 10 km grid, does not accurately resolve flow into and out of coastal bays. Consequently, we cannot determine the use of coastal bays as nursery areas at this time. Statistical evaluation of the ability of the walleye pollock biophysical model to reproduce observed distributions of early larvae and juvenile walleye pollock (Hinckley et al., this issue) increases the credibility of using IBMs to understand pollock early life history.

3.3 Model projections: Retention and connectivity in GOA and links to BS and surrounding areas In our simulation the most prominent GOA PNAs were to a large extent characterized by a high retention level. The maximum mean retention of age-0 juvenile walleye pollock, integrated through time by September 1st, was 0.28 in the Shumagin Islands Inner area (SIin). This was followed by Prince William Sound Inner area (PWSin) and Outer Cook Inlet (OC) area with retention proportions of 0.22 (Fig. 6a). Eggs spawned in February had the lowest proportion of retention, while those spawned in May had the highest retention with the exception of SIin where the highest retention is reached in April (Fig. 6b). This is consistent with what has been observed and hypothesized about pollock larvae. Several retention mechanisms have been proposed in GOA: larvae after spawning can be transported onshore, trapped in meanders of weaker or

reversed flow or entrained in eddies (Bailey et al., 1995; Bailey et al., 1997; Bograd et al., 1994; Hinckley et al., 1991; Shumacher and Kendall, 1991; Shumacher et al., 1993). These mechanisms can increase larval residence time and retention, and lessen their chances to be advected offshore. In addition, in the model, retention is a function of physical forcing, the ability to self-locomote, as well as, the temperature that affect development and growth of early stages and the timing on reaching self movement. Therefore, high retention will be factored for all these processes together. Concerning connectivity, an interesting finding of this study was that the BS can be an important nursery area for several spawning grounds located in the GOA. The simulations showed the highest density of surviving pollock (simulated, Fig. 5a) in the outer domain of the WBS (areas 31, Fig.1) followed by the western regions of WBS (areas 32 and 36; Fig.1). From these PNAs, the lowest coefficients of variation were associated with the outer domain of the WBS (Fig. 5b), except for area 31 (BSSo) and the eastern portion of area 32 (BSSb; Fig.1). Monthly variability of spawning affected survival, with transport into the BSSb area (the highest density of surviving pollock; Fig.7) increasing among eggs released up to April and then decreasing in May. Transport to the BSSo area increased for spawning occurring from February to May, while the opposite pattern was observed in BSCm and BSCb (Fig.7). Simulated walleve pollock spawned during February in the Shumagin Islands were transported to the BS, with few retained in this region (Shumagin Islands, Fig. A2 appendix). There is evidence that walleve pollock spawning locations have shifted in recent years, and additional spawning areas (Unimak Pass, Semidi and Shumagin Islands) have been described (Ciannelli et al., 2007). As an example, recent acoustic surveys have observed concentrations of spawning fish in the Shumagin Islands (Dorn et al., 2013). Little is known about the fate of walleye pollock spawned in this region (Dorn et al., 2013). Our model showed that the average transport through Unimak Pass (~0.5 Sv), the mechanism linking the GOA and BS, is consistent with values found in Stabeno et al. (2002), leading to the conclusion that it is unlikely that the physical model overestimated flow to the BS. Other studies also support this mechanism of connection between the GOA and BS (Gibson et al., 2013). The analysis of the connectivity matrix integrated by sectors showed strong retention within the GOA. High retention is observed in the CGOA (25.9%) and EGOA (23.8%), while the WGOA showed only 7.2% retention (Table 2). Within the GOA, the highest connectivity is observed from the EGOA to the CGOA (57.8%) followed by the connection from the CGOA to the WGOA (24.3%). Overall, the most prominent connections were the ones found between sectors in the GOA and the BS, such as the connectivity from the WGOA to the WBS (62.8%) and from the CGOA to the WBS (29.2%, Table 2). Based on these spawning and nursery connectivity matrices, four hypothetical spawning scenarios for the GOA were built to better understand the contribution of different spawning scenarios to PNAs, and the connectivity to regions out of the GOA (Fig.8):

Scenario A: Spawning occurs in the EGOA sector (Fig.8, upper left). Under this scenario, close to 93% of eggs spawned in EGOA stays in the GOA, with the remainder transported to the BS (3%) and the AL (4%).

Scenario B: Spawning occurs in CGOA sector (Fig.8, upper right). Only 50% of eggs spawned in the CGOA stay in the GOA, with moderate retention in the CGOA. The remaining survivors have nursery grounds in the BS (35%), in the AL (12%) and in the BAS (3%).

Scenario C: Spawning occurs in WGOA sector (Fig. 8, lower left). Only 7% of eggs spawned in the WGOA stays in the GOA. The majority of eggs end up in nursery grounds in the BS (81%), some in the AL (7%), and a small percentage in the AR (2%).

Scenario D: All spawning sectors combined. The overall mean connectivity from the model predicts that 40% of surviving juveniles spawned in the GOA are exported to the BS (mainly to

WBS and secondarily to EBS, see Table 2) and 50% are retained in the GOA (mainly in the CGOA and secondarily in the WGOA). The remaining juveniles are exported to the AL (7.5%), the AR (0.5), and the BAS (2%).

Our results of modeled scenarios A (only EGOA) and B (only CGOA) suggest that spawning in the EGOA and CGOA sectors promote retention of juveniles in the GOA. Scenario C (only WGOA) is the one that showed the strongest connectivity with the BS (EBS and WBS). Scenarios B, C and D (all spawning combined) suggest that GOA spawning success and transport rates may be influencing walleye pollock recruitment in the BS, especially in cases when spawning occurs in the WGOA, a sector that is highly connected to the WBS and secondarily to the EBS. It is important to note that recruitment will depend on the relative sizes of the spawning biomass in the EBS, AL and GOA. Various possible outcomes can occur when larvae and juvenile are transported to the BS. If surviving GOA juveniles in the BS develop, grow, and recruit to the BS fishery, then transport of individuals to the BS influences walleye pollock cohort strength in both the GOA and the BS. The impact of this emigration may not be large on the BS walleye pollock population as the BS pollock stock is an order of magnitude larger than the GOA stock. Survival rates of GOA pollock in the BS may also be low, given that juvenile pollock in the BS (age-1's and 2's) tend to be observed in waters of the northern BS (i.e., west of 170°, (Honkalehto et al., 2013). BS walleye pollock originating in the GOA would have to run the gauntlet of cannibalistic pollock and increasing numbers of arrowtooth flounder (Atheresthes stomias) that are found in the GOA and in the southern half of the Bering Sea (Turnock et al., 2005). There is also the possibility that GOA walleye pollock juveniles that initially settled in the BS may return to the GOA as pre-recruits or adult fish. At the current state, the IBM only simulates egg through age-0 juvenile life history stages. Despite GOA spawned pollock transported to ay may stay in the B, there is uncertainty whether that fish will two years later recruit to the commercial fishery.

Mixing of pollock larvae spawned in the GOA and BS might occur particularly over the Middle and Outer Domains of the BS continental shelf, although the influx would be extremely low relative to larvae of BS origin (Batchelder et al., 2010). Our simulation results showed strong connections between the WGOA and BS, which are supported by other studies that have suggested that eggs and larvae may be advected into the BS through Unimak Pass, a potential conduit for exchange between the GOA and the BS (Lanksbury et al., 2007; Duffy-Anderson et al., in press). This might suggest a metapopulation structure for pollock in Alaska. In contrast, studies indicate genetic differentiation among pollock in the GOA and BS. However, genetic differences appear between broad regions, but resolution between adjacent stocks is lacking (Bailey et al., 1999), and the boundaries between regional stocks are poorly defined (Grant el at., 2010). A shift in pollock spawning locations to the WGOA sector such as Unimak Pass, Semidi and Shumagin Islands (which is strongly connected with the BS in the model), have been recently described (Ciannelli et al., 2007). Genetic differences between populations, prompted under the response of subpopulation contraction-expansion to environmental variability (Grant et al., 2010) and/or spawning shifts, do not accumulate on small spatial and temporal scales. Although speculative, larval drift mechanisms operating in the recently described shifted spawning areas in the WGOA might lead to incipient homogenization of the stock in the GOA-BS boundary, at a scale at which genetics are not sensitive yet. Future studies should incorporate realistic initial spawning conditions such as Doyle et al. (this issue), and explore interannual variability in spawning location on connectivity. Understanding the effects of this variability on transfers between spawning and nursery areas would provide insight to local and metapopulation dynamics, community structure, and genetic diversity (Hastings and Harrison, 1994), and can be used to evaluate and design resource management strategies.

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Figure captions

Figure 1. Map of the names of the areas used to set the spawning and nursery areas in eastern (EGOA), central (CGOA) and western the Gulf of Alaska (WGOA), the Aleutians (AL), the western (WBS) and eastern Bering Sea (EBS), the Arctic (AR) and the Basin (BAS) sectors. The spawning grounds corresponded (white circle) to the areas: 2: Inner Cook Inlet (InC), 3: Prince William Sound Inner (PWSin), 5: Outer Cook Inlet (OC), 6: Seward Inner (Sin), 8: Shelikof Strait North (SSN), 9: Kodiak Island North (KIN), 11: Shelikof Strait Exit (SSE), 12: Kodiak Island South (KIS), 14: Sutwik (Sut), 15: Semidi Islands (SemI), 17: Shumagin Islands Inner (SIin), 18: Shumagin Islands Outer (SIo), 20: Unimak Pass (UP), 21: Unimak Pass Outer (UPo). The potential nursery areas explored with the model were the same as the spawning areas (above) plus the following areas: 0: South East Alaska (SEA), 1: Yakutat (Yak), 4: Prince William Sound Outer (PWSo), 7: Seward Offshore (So), 10: Kodiak Island North Offshore (KINof), 13: Kodiak Island South Offshore (KISof), 16: Semidi Islands Offshore (SemIo), 19: Shumagin Islands Offshore (Siof), 22: Unimak Pass Offshore (UPof), 23: Unalaska Island (UI), 24: Unalaska Island offshore (UIof), 25: Chagulak Island (CI), 26: Adak (Ad), 27: Cobra Dane (CD), 28: Offshore (Off), 29: Bering Sea South Inner domain (BSSin), 30: Bering Sea South Middle domain (BSSm), 31: Bering Sea South Outer domain (BSSo), 32: Bering Sea South Basin (BSSb), 33: Bering Sea Central Inner domain (BSCin), 34: Bering Sea Central Middle domain (BSCm), 35: Bering Sea Central Outer domain (BSCo), 36: Bering Sea Central Basin (BSCb), 37: Bering Sea North Inner domain (BSNin), 38: Bering Sea North Middle domain (BSNm), 39: Bering Sea North Outer domain (BSNo), 40: Bering Sea North Basin (BSNb), 41: Arctic Inner domain (Arin), 42: Arctic Middle domain (Arm), 43: Arctic Outer domain (Aro), and 44: Arctic Basin (Arb)

Figure 2. Comparison of modeled Eulerian velocities (black) and observations from satellitetracked Lagrangian drifters (red) deployed by the Alaska Fisheries Science Center (AFSC, NOAA) and the Pacific Marine Environmental Laboratory (PMEL).

Figure 3. Scatter plot between modeled and measured u (crosses) and v (circles) velocity component of the current.

Figure 4. The mean flow through Unimak Pass calculated at 40 m depth by month in the simulation years (dots). Positive values indicate flow through Unimak Pass to Bering Sea (Gulf of Alaska).

Figure 5. Contour map of modeled juvenile a) mean and b) coefficient of variation of densities on day of the year 215 showing potential nursery areas through the whole domain.

Figure 6. Retention of juvenile age-0 walleye pollock in each spawning area. a) Proportion of juvenile age-0 pollock retained in spawning areas where released, over all simulations. b) Proportion of juvenile age-0 pollock retained in spawning areas where released, by month of release (1st February, 1st March, 1st April, 1st May).

Figure 7. Proportion of age-0 juveniles that were alive at the end of the simulation (September 1st) by nursery area. The bars represent the month of release of the eggs.

Figure 8. Conceptual model of connectivity within the Gulf of Alaska (GOA) and between the GOA, the AL and BS based on potential spawning scenarios: Scenario A: only EGOA spawning

sector, Scenario B: only CGOA spawning sector, Scenario C: only WGOA spawning sector, and Scenario D: All spawning sectors combined.

Figure A1. Time-averaged modeled velocities (March through September) for the years a) 1978, b) 1982, c) 1988, d) 1992, e) 1999 and f) 2001. Speeds are shaded (m/s); normalized vectors indicate the direction.

Figure A2. Connectivity matrix showing proportion of age-0 juveniles that are found on September 1st in a specific nursery area for eggs released in a) February, b) March, c) April, and d) May.

















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Figure 7 color Click here to download high resolution image



Figure 7 B&W Click here to download high resolution image





	or suspected watteye portoes spawining and nursery at	cas III uic Ouil Ol Alaska.	
Areas	Observed area	Simulated area	References
Spawning ground	Shelikof Strait and Sea Valley	Shelikof Strait Exit (SSE), Shelikof Strait North (SSN), Semidi Islands (Seml), Sutwik Island (Sut)	[3]
	Shelf water to the Northeast of Kodiak island	Kodiak Iskand South (KIS), Kodiak Island North (KIN), Seward Inner (Sin), Outer Cook Inlet (OC)	[3]
	Vicinity of Shumagin Islands to the Southwest	Shumagin Islands Inner (Slin) and outer (Sio), Unimak Pass (UP) and outer (Upo)	[3]
	Inner Cook Inlet	Inner Cook Inlet (InC)	[4]
	Entrance to Prince William Sound	Prince Williams Sound Inner (PWSin)	[1,2]
	Middleton Island	Seward Inner (Sin)	[1,2]
	Marmot Bay	Kodiak Island North (KIN)	[1,2]
	Shelikof Strait	Shelikof Strait North (SSN)	[1,2]
		Shelikof Strait Exit (SSE)	
	Chirikov shelf break	Semidi Islands (Seml)	[1,2]
	Shumagin Gully	Shumagin Islands Inner (Slin)	[1,2]
	Morzhovoi Bay	Unimak Pass (UP)	[1,2]
Nursery ground	Shumagin area from Semidis islands to Unimak		[5, 6, 7]
	Pass	Sutwik Island (Sut)	
		Semidi Islands (SemI)	[5, 6, 7]
		Shumagin Islands Inner (Slin)	[5, 6, 7]
		Shumagin Islands Outer (SIo)	[5, 6, 7]
		Unimak Pass (UP)	[5, 6, 7]
		Unimak Pass Outer (UPo)	[5, 6, 7]
	North of Kodiak Island	Outer Cook Inlet (OC)	[5, 6, 7]

Table 1. Known or suspected walleve pollock spawning and nursery areas in the Gulf of Alaska.

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		[5,6,7]
	Seward Inner (Sin)	
North East of Kodiak Island	Kodiak Island North (KIN)	[5,6,7]
Southwest of Unimak Pass	Unimak Pass (UP)	[5, 6, 7]
The areas have been identified by Ecosystems and Fish ses as snawning regions [2] The Shelikof Strait Acous	ries-Oceanography Coordinated Investigations o Survey estimates by NFMS (Dorn et al. 201)	(ECO Foci)

[1] The areas have been identified by Ecosystems and Fisheries-Oceanography Coordinated Investigations (ECU Foci) cruises as spawning regions. [2] The Shelikof Strait Acoustic Survey estimates by NFMS (Dorn *et al.*, 2013). [3] Doyle *et al.*, (this issue).[4] Rodrigues *et al.* (2006).[5] Brodeur and Wilson, 1996. [6] Wilson *et al.*, 1996. [57] Wilson, 2000.