Methods to utilize known habitat to filter data for indices of abundance from a recreational fishery survey in California

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Abstract

Indices of abundance developed from fishery-dependent data are typically subject to a number of assumptions about the area and habitat fished due to the aggreation of the catch at the level of a fishing trip. In California, two surveys occur onboard the recreational charter boats fleet and samplers record location-specific data on the catch and effort during individual fishing stops throughout a trip. This location specific information coupled with high-resolution maps of the bottom substrate allowed us to subset the the survey data to areas of rocky reef habitat. The six species of rockfish (*Sebastes* spp.) modeled in this paper as example all have high affinity to rocky habitat. We compared the indices of abundance developed from data filtering at the finest scale of a fishing drop using the maps of rocky reef to filter the data to the same data using only county of landing as an indicator of location. In addition, we aggregated the data across a trip to mimic data available from a dockside survey that occurs after a fishing trip to further explore the effect of datacourseness on data filtering an indices of abundance. For the data without any fishing location identified we applied the commonly used Stephens-MacCall method to identfy samples for the indices of abundance. The identification of the rocky reefs also allowed us to weight the index of abundance by the area of available habitat with predefined regions. We show that in general the

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1. Introduction

Integrated fisheries stock assessment models utilize a variety of data sources to develop the most complete picture of the stock and current status. Indices of abundance are one such data stream that provide a time series of an observed portion of the stock with the assumption that the trends are proportional to the stock's abundance (Harley et al., 2001). Ideally, a stock assessment would incorporate indices of abundance developed from both fishery-independent surveys and fishery-dependent surveys. It can often be the case that only fishery-dependent data are available due factors including the lower cost to collect fishery-dependent data, increased opportunities data collection and the ease of which data can be collected. For fishery-dependent data, catch per unit effort (CPUE) is a common metric that provides information on the relative density of fish encountered (Maunder and Punt, 2004). more on F-D data

Within the recreational CPFV fleet, the target species can change within a trip and between trips is are dependent on a number of factors. Some of these factors include weather that

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could limit transit to some fishing grounds, bag limit regulations, angler preference and experience, and the captain's experience level. In order to create an index of abundance from fishery-dependent data an analyst must be able to subset the fishery-dependent data to those samples that fished in the appropriate location for a species of interest.

Depending on the target species, the data may contain a high proportion of zero observations across samples. The question arises as to whether fishing occurred within the species of interest's habitat and the species was not observed or if the sampling occurred outside of the species' habitat (structural zeroes). Including structural zeroes in the models used to standardize of indices of abundance adds noise and added variability (citation). Fishery surveys of the recreational CPFV fleet often occur after fishing for the day has ended. These data often report a single fishing location for a trip, but it is often the case that multiple locations are fished over the course of the day and may or may not encounter the same suite of species depending on factors such as depth, bottom habitat type, and other environmental conditions.

Here we focus on data available from a fishery-dependent survey of the recreational partyboat (commercial passenger fishing vessel fleet (CPFV)) in California, specifically a survey where a sample rides along on paid fishing trips (onboard observer survey). The effort on the onboard observer survey is the number of anglers multiplied by the amount of time fished, to produce angler hours. In addition, we are able to utilize high resolution bathymetric data to define appropriate habitat for the target rockfish (*Sebastes* spp.) species.

It is not often the case where high-resolution habitat data and fishing location information are both available, and for many fishery-dependent surveys an analyst will have to determine which subset of the data to use based on available information. The onboard observer data provide an opportunity to explore what information we gain from explicit knowledge of fishing locations. There are two surveys of the California recreational CPFV fleet, both using the same methodologies, that provide information on the catch, effort and fishing location during CPFV trips (Monk et al., 2014). Both the California Department of Fish and Wildlife (CDFW) and the California Polytechnic State University San Luis Obispo (Cal Poly) conduct a survey where a sampler rides along during a CPFV trip with paid anglers and records data at each individual fishing stop (referred to as the onboard observer surveys). Paired with recently available high-resolution bathymetry data provided an opportunity to map each individual fishing drift onto known habitat type (hard vs. soft substrate).

One of the major recreational targets in California are bottomfish species, a group of over 100 species, 92 of which are rockfish species (*Sebastes spp.*). Many of the recreationally targeted rockfish have a high association to rocky habitat as adults. The affinity to rocky habitat differs by species and ranges from a species like the gopher rockfish (*Sebastes carnatus*) that resides within crevices, to schooling species that inhabit the mid-water such as the black rockfish (*Sebastes melanops*). The association of these species make them ideal candidates for exploring the ability to filter fishery-dependent data based on known habitat. In addition, the habitat data creates an opportunity to weight the index of abundance by the calculated area of rocky reef habitat along the California coast. xxxxxx

To explore how indices of abundance change depending on assumptions made during the data filtering steps, we utilized the onboard observer data create data sets and indices at three levels of data courseness. At the finest scale we utilized the fishing drift level data with known location from the onboard observer surveys and subset data based on the proximity to rocky reef habitat. We then treated the drift-level data as if the location of the individual fishing drifts were not available, and lastly, we aggregated the drift-level catches to the level of a single trip. For the last two two cases where we removed the location information, we filtered the data using the Stephens-MacCall method. We applied these methods across six nearshore rockfish species with different life histories,habitat preferences and commonness in the data.

A commonly used method to filter fishery-dependent data to the samples representing the effect fishing effort of the target species and exclude structural zeroes is the Stephens-MacCall method (2004). The Stephens-MacCall method is a binomial model used to predict the probability of encountering the target species in a sample, based on the presence and absence of a suite of co-occurring species. This method is commonly used to filter data that are collected dockside after a vessel returned to port or when location data are not provided. We applied the Stephen-MacCall method to both the trip-level data and the drift-level data to explore differences in the courseness of species composition effects data filtering and the index of abundance.

2. Methods

We developed indices of abundance for six species or species pairs of rockfish (*Sebastes spp.*) that are of management interest on the U.S. West Coast: black rockfish (*S. melanops*), the blue and deacon rockfish (*S. mystinus*/*S. diaconus*), brown rockfish (*S. auriculatus*), China rockfish (*S. nebulosus*), gopher rockfish (*S. carnatus*), and the vermilion and sunset rockfish (*S.miniatus*/*S. crocotulus*). The two cryptic species pairs (blue/deacon and sunset/vermilion rockfish) are genetically identifiable, but not separable within the onboard observer survey time series. These six species all have different latitudinal distributions, exploitation histories, and habitat and depth preferences(**?**).

2.1. Survey Data and Habitat-based Filtering

The California Department of Fish and Wildlife (CDFW) began a fishery-dependent onboard observer survey of the Commercial Passenger Fishing Vessel (CPFV or party/charter boat) fleet in 1999. In 2004, the survey became part of the CDFW's California Recreational Fisheries Survey (CFRS, *add year and cite website*) that includes additional surveys to quantify catch and effort by the recreational fleet. In response to a request from the fishing industry, the California Polytechnic State University Institute of Marine Science, San Luis Obispo (Cal Poly) began a supplemental onboard observer survey in 2001 of the CPFV fleet based in Port Avila and Port San Luis along the Central Coast [#fig-map]. Both the CDFW and the Cal Poly onboard observer surveys continue through present day; however, due to both spatial and temporal recreational regulation changes we limited the data for this research to the years 2004 to 2016. Between 1999 and 2003, the recreational regulations evolved from no restriction on the number of lines or hooks an angler could deploy to a one line and two-hook maximum, as well as implementation of depth restrictions. Subsequent management allowed a relaxation of depth restrictions beginning in 2017, potentially shifting fishing effort relative to the 2004-2016 period (?).

While only a small portion of the total CPFV trips taken are sampled as part of the onboard observer survey, the onboard observer survey collects a large amount of data during each trip. During each trip the sampler records information for each fishing drift, defined as a period starting when the captain announced "lines down" to when the captain instructs anglers to reel their lines up. Just prior to the start of each fishing drift, the sampler selected a subset of anglers to observe, at a maximum of 15 anglers per drift. The sampler records all fish encountered (retained and discarded) by the subset of anglers as a group, i.e., catch cannot be attributed to an individual angler. Samplers also record the start and end times of a drift, location of the fishing drift (start latitude/longitude and for most drifts, end latitude/longitude), and minimum and maximum bottom depth. Fish encountered by the group of observed anglers are recorded as either retained or discarded. This provides information on the catch (count of each species) and effort (time and number of anglers fished) during each fishing drift. While both surveys include records of discarded fish, we only used the retained catch in these analyses. Discarded fish can often represent a different size structure than retained fish, either due to size limits or angler preference, or represent fish encountered during a temporal or spatial closure.

The SWFSC developed a relational database for the CDFW onboard survey from 1999-2010(2014) that has been updated annually. The Cal Poly data are also provided to the SWFSC annually. All data were checked for potential errors at the drift-level by SWFSC staff.

The CPFV data included only areas north of Point Conception ($34°27'N$) due to gaps in habitat coverage further south. Point Conception is a significant biogeographic boundary (**?**), the composition of the fish communities in southern California differ, and the recreational fisheries are fundamentally different, with a higher percentage of trips targeting mixed species and pelagic and highly migratory species, as well as more limited access to rocky habitat nearshore.

After filtering the data to north of Point Conception, we further removed drifts that may not accurately define a successful fishing drift or represent data errors, the upper and lower 1% of the recorded time fished and recorded observed anglers were removed. Given that the fishery was closed deeper than 40 fathoms for the entire time period from 2004-2016, we filtered the data to retain 99% of all drifts based on average drift depth. We calculated average depth from the recorded minimum and maximum depths when available or the imputed minimum and maximum depth from the bathymetry layer described in the next paragraph. A depth cutoff slightly deeper than the maximum allowed is reasonable given the variability in habitat fished and all retained drifts occurred within California state waters (up to 3 nm from shore).

High resolution seafloor mapping data allowed us to map each drift from the onboard observer surveys with predicted habitat (referred throughout the paper as the drift-level, habitat-informed data). We utilized the bathymetry and backscatter data collected by the California Seafloor Mapping Program (CSMP) (**?**). The CSMP mapped California state waters at a 2 m resolution north of of Point Conception to the California-Oregon border. A total of 137 CSMP substrate blocks that ranged in size from 16 km^2 to more than 400 km^2 were mosaicked together by authors. Rough and smooth substrates were identified by CSMP using two rugosity indices, surface:planar area, and vector ruggedness measure (VRM) of the bathymetric digital elevation model [#fig-map2]. The CSMP set a varying VRM threshold for each of the substrate blocks, removed any artifacts, and is considered a conservative estimate of rough habitat.

The 137 CSMP substrate raster blocks were then mosaicked together by authors, and converted the pixels designated as rough habitat (rocky habitat proxy) from a raster format to polygons, and calculated a 5 m buffer around the rough habitat polygon to allow for any small errors in positional accuracy using ArcMap 10.7 (ESRI citation). The area of each reef polygon was calculated, and those reefs greater than or equal to 100 m^2 were included. Contiguous polygons identified as rocky substrate were defined as a singular rocky reef, regardless of size. The area of rocky habitat for this paper was calculated to exclude portions of the reef that extended outside of California state waters (further than 3 nm from shore). The mapped area does not include very shallow areas close to shore, which extend approximately 200-500 m from the shoreline. Fishing by the CPFV fleet is limited in these waters due to shallow depths and kelp beds. We assigned fishing drifts to reefs based on the recorded start location of a drift, given that the end locations of drifts were not always recorded. The distance from the recorded drift start location to the nearest rocky habitat was calculated in meters. For each target species, we calculated the cumulative distribution of distance to rocky reef for drifts that retained the target species and used a distance cutoff of 90% for each species. To illustrate the similarities and differences among the six species, we plotted the percent of fishing drifts within an aggregated region that where the species was present and retained. To show the differences in the general commonness or rarity of the species we calculated the average CPUE, before standardization, for each species and aggregated area. We also downloaded the effort estimates for the CPFV trips from RecFIN to compare the the the area of rocky habitat with the effort in each region as well as the distribution of observed trips.

2.2. Stephens-MacCall Data Filtering

We applied the Stephens-MacCall method to both the drift-level data and the trip-level data (2004). For the drift-level data we removed all location and depth identifiers for a drift and kept the county of landing as a spatial identifier. To construct a data set that mimicked trip-level data, we took the drift-level data, aggregated the observed retained catch within a trip, and kept the county of landing as a spatial identifier. We then compared results using two levels of aggregation (catch rates by drift and trip) to illustrate the impact of having less spatially-explicit data on both data filtering and the resulting indices of abundance.

Prior to any filtering a total of 19,425 drifts that aggregated to 2,270 trips were available for the analyses. The number of initial samples used for the Stephens-MacCall filtering method were higher than the habitat-informed data described in the previous section because retained drifts with missing locations (latitude/longitude).

Before applying the Stephens-MacCall method, we identified a suite of potentially informative predictor species for each of the six target species. Species that never co-occurred with the target species and those present in fewer than 1% of all drifts and 3% of all trips were removed to reduce the number of species to those that were informative. A lower threshold of 1% was selected for the drift-level data due to the change in magnitude of the number of samples when using drifts vs trips.

The remaining species all co-occurred with the target species in at least one trip and were retained for the Stephens-MacCall logistic regression. Coefficients from the Stephens-MacCall analysis (a binomial generalized linear model) were positive for species that are more likely to co-occur with the target species, and negative for species that were less likely to be caught with target species. The intercept represented the probability of observing only the target species in a sample. We also calculated the 95% confidence interval for each coefficient.

Stephens and MacCall proposed filtering (excluding) samples from index standardization based on a criterion of balancing the number of false positives and false negatives from the predicted probability of encounter. False positives (FP) are trips that are predicted to encounter the target species based on the species composition of the catch, but did not. False negatives (FN) are trips that were not predicted to encounter the target species, given the catch composition, but caught at least one target species. Stephens and MacCall recommended a threshold where the false negatives and false positives are equally balanced, however, this threshold does not have any biological relevance and for this particular data set where trained samplers identify all fish. We assumed that if the target species was encountered, the vessel fished in appropriate habitat.

Of interest for the index of abundance was the elimination of trips that had a low probability of catching the target species given the other species caught on the trip. Therefore, we retained all of the trips that caught the target species and those trips that did not catch the target species, but had a probability higher than the threshold balancing the false negatives and false positives. This practice has commonly been used in recent stock assessments of rockfish on the West Coast.

2.3. Indices of Abundance

Four standardized indices of abundance were generated for each of the six species, one each for the data filtering method (drift-level habitat-informed, drift-level Stephens-MacCall, trip-level Stephens-MacCall) and an area-weighted index from the habitat-informed drift-level data. All indices were modeled using Bayesian generalized linear models (GLMs) and the delta GLM method (Lo et al., 1992; **?**). The delta GLM method is commonly used to standardize catch-per-unit effort for stock assessments [citations]. The delta method models the the data with two separate GLMs; one for the probability of encountering the species of interest from a binomial likelihood and a logit link function and the second models the positive encounters with either gamma or lognormal error structure. The error structure of the positive model was selected via the Akaike Information Criterion (AIC) from models with the full suite of considered explanatory variables.

The response variable for the positive models was angler-retained catch per unit effort. For the indices modeled at the level of a drift, effort was calculated as the number of angler hours fished on a drift. The trip-level effort was calculated as angler days, using the average number of observed anglers across all drifts on a trip.

To keep comparisons across data filtering methods similar, depth was not considered as an explanatory variable in the habitat-informed index. Depth is often a significant explanatory variable for rockfish species, with many rockfish species and populations separated by depth (**?**). Year was always included in as an explanatory variable in model selection, even if it was not significant, because the goal of the index of abundance was to extract the year effect. Other explanatory variables considered for the habitat-informed index were aggregated regions rocky reefs (categorical variable*)* and wave (a 3-month aggregated period of time, e.g., January-March). The area-weighted index also included a year/rocky reef interaction term, even if it was not statistically significant, to allow us to weight the index by the area of rocky reef. The regions of rocky reef were aggregated differently for each species to ensure adequate sample sizes to explore the year/rocky reef interaction.

Explanatory variables for the two indices using the data filtered using Stephens-MacCall method (blind to habitat information at the drift- and trip-level) included only year, wave and aggregated counties of landing. California has 14 coastal counties north of Point Conception, 11 of which were represented in these data. We aggregated the northern counties of Del Norte, Humboldt and Mendocino into one region, Sonoma and Marin counties just north of San Francisco into another region and Alameda and San Francisco counties into a third region. The remaining counties of San Mateo, Santa Cruz, Monterey and San Luis Obispo remained unaggregated.

Model selection for the binomial and positive observation models was based on AIC using the lme4 package in R, and unless very different predictors were selected, the same predictors were used in each of the two Bayesian models. The Bayesian models were run with 5,000 iterations and weakly informative priors. Posterior predictive model checks were examined for both the binomial and positive observation models, including the predicted percent positive compared to the maximum likelihood estimates. We constructed the final year index by multiplying the back-transformed posterior draws from the binomial model with the exponentiation of positive model draws, and taking the mean and standard deviation for each year.

The area-weighted habitat-informed index was developed by extracting the posterior draws of from each year and area combination of the binomial and positive posterior predictions, and then summing across the product of the back-transformed posteriors weighted by the fraction of total area within each reef. To compare the indices across the three data filtering methods and the area-weighted index, each index was scaled to its mean value.

3. Results

3.1. Survey Data and Habitat-based Filtering

The data sets were filtered for errors within the relational database before analyses were conducted, and the data used here reflect changes from the QA/QC process that may not be reflected in the raw data available directly from the CDFW. Approximately 21% of all the CDFW observed CPFV trips from 2004-2016 occurred north of Point Conception and it is important to note that north of Bodega Bay, California, the majority of charter boats are smaller 6-pack vessel that may not have the capacity to carry a sampler onboard. The addition of the Cal Poly onboard observer survey to the CDFW survey increased the sample sizes of observed trips in San Luis Obispo county by an average of 155% from 2004-2016.

From 2004-2016 the drift-level data contained a total of 19,425 fishing drifts, and after removing drifts with missing effort information (time fished and/or observed anglers), 19,180 drifts remained. The filter removing the upper and lower 1% of the time fished and number of observed anglers resulted in fishing drifts lasting between three and 96 minutes and three to 15 observed anglers, and reduced the data to 18,591 fishing drifts. The remaining data filter for depth resulted in a cutoff of 46.6 fathoms, and retained 18,405 drifts based on average drift depth. A filter on the minimum depth was not included here because the recreational fleet was not limited to a minimum fishing depth and all of the fishing drift locations were verified during the QA/QC process.

We defined 108 areas of rocky habitat within California state waters from the California/Oregon border to Point Conception. The 2 m resolution of the substrate shows the patchiness and heterogeneity of the rocky substrate (Figure 1). We adopted the same thresholds to define rocky habitat as determined by the United States Geological Survey (USGS). While the location-specific data from the fishing fleet is governed by confidentiality and cannot be displayed here, 85% of the fishing drifts were withing 5 m of rocky habitat. The recreational fishing fleet's targeting of rockfish species was verified by the distributions of the distance from rocky habitat for each of the six species. The distance from rocky habitat cutoff (retaining 90% of drifts encountering each species) for blue, China and gopher rockfish was six meters, eight meters for vermilion rockfish, 14 meters for black rockfish and 16 meters for brown rockfish. The percentage of drifts and trips encountering the target species can be found in Table 2.

Based on exploratory analyses and consideration of the available data, the areas of rocky habitat were grouped into six regions to ensure adequate sample sizes for developing indices of abundance (Figure 2). While covering a small area (5% of the rocky habitat), the number of observed fishing drifts within state waters around the Farallon Islands off the coast of San Francisco was high enough to warrant keeping it as a separate area of rocky habitat. The region defined from the California/Oregon to San Francisco encompasses 49% of the total rocky habitat in state waters by area, but only 12% of the observed drifts (2,637) fished in this area. Each of the four remaining regions of rocky habitat defined from San Francisco to Point Conception contained an average of 12% of the available habitat. The CDFW estimated fishing effort by management district, which does not exactly align with our areas of grouped reef habitat. Only considering the fishing effort north of Point Conception, CDFW estimated an average of 9% of the CPFV from the California/Oregon border through Mendocino County, 38% from Sonoma through San Mateo County, and 53% from Santa Cruz to Point Conception.

The differences in latitudinal distribution of the six species is apparent from the maps of percent of positive observations (Figure 3). Black rockfish are distributed north of San Francisco, a more northerly distribution reflected in the aggregation of data from Santa Cruz and south, whereas brown rockfish is distributed across coastal California. Percent positive catch generally showed higher catches south of San Francisco for vermilion, gopher, brown, and blue rockfish. The percentage of drifts retaining China rockfish was low coastwide. The average CPUE was highest for blue rockfish between San Francisco south to Big Sur (Figure 4). The average CPUE for black rockfish average CPUE was higher in the north, while gopher rockfish CPUE was generally consistent across the coast, albeit slightly higher south of Big Sur. China rockfish CPUE catch was typically low coastwide, with slightly higher catch rates in the Farallon Island reefs.

The final aggregation of the reefs and total area within each region are found in Table 1 and reflect the distribution and patterns in the visual representation of commonness in the data. The fraction of drifts retained for the indices of abundance was high for all six species (80% or greater), indicating that many of drifts within these data occurred near areas of rocky habitat.

3.2. *Stephens-MacCall Data Filtering*

A total of 19,425 drifts that aggregated to 2,252 trips were used for the trip-level Stephens-MacCall filtering. In general, the co-occurring species used for the Stephens-MacCall method were similar for the drift-level and the trip-level data. We present the coefficients and 95% confidence intervals for the species coefficients for black rockfish and brown rockfish at the trip-level in Figure 5. The plots for black rockfish and brown rockfish at the drift-level and all plots for the remaining four species are available in the supplemental materials. The confidence intervals were larger for the trip-level data and the co-occurring species at the drift-level provide a refined look at species that have positive coefficients. For black rockfish, a noticeable difference is the intercept. At the trip-level the intercept (probability of catching the target species, given that none of the indicator species were caught) is uninformative and at the drift-level the intercept is strongly negative. A higher fraction of the co-occurring species are uninformative information about the target species in our study (the 95% confidence interval crosses zero) for the trip-level data than the drift-level.

The percentage of samples retained for each data filtering method differed by species, but followed the general trend that the lowest percent of samples were retained from the Stephens-MacCall filtering at the drift level, ranging from 12% of samples retained for China rockfish and 54% for blue rockfish (Table 2). A much higher percent of samples were retained both from the other two methods, with an average of 83% of drifts retained when habitat was included as a filter. Data filtering for the trip-level indices that retained all positive observations resulted in a high proportion of positive samples (0.70 - 0.86) for all species.

To determine how consistent the Stephens-MacCall trip-level filter was with the habitat-informed filter, we looked at the distance to reef from all of the drifts contributing to trips that were used for the trip-level index. This provides a proxy for how well the Stephens-MacCall method infers habitat from species associations. Using the same distance from reef cutoff by species as calculated from the habitat-informed data, we calculated the percentage of drifts that were further from a reef than would be expected, but used in the data to develop the trip-level index. The percentage of drifts contributing to the trips outside reef habitat was 11% for black rockfish, 13% for blue rockfish, 10% for brown rockfish, 12% for China rockfish, 12% for gopher rockfish, and 11% for vermilion rockfish.

3.3. Indices of Abundance

All but three of the 24 indices of relative abundance were modeled with a lognormal distribution. The trip-level indices for black, blue and gopher rockfish were modeled using a gamma distribution as selected by AIC (AIC values available in the supplementary material). All of the covariates (year, reef, and wave) were selected for both the binomial and positive models for all species in the habitat-informed drift level index. Gopher rockfish was the only case for the drift-level habitat-informed index where different models the covariates year and reef were select over year, reef and wave. However, the change in AIC was one so we chose to maintain the model with year, reef and wave.

(LMK and I can put these in a table in the doc) The full model that included the reef:year interaction was selected by AIC for all species except for China rockfish. For China rockfish the positive binomial model selected the interaction covariate, but the model without the interaction was select for the positive lognormal model by an difference in AIC of 22. However, in order to look at the effects of the area-weighting on the index, we included the year:reef interaction in the final model for China rockfish.

For both the drift-level and trip-level Stephens-MacCall filtered data, year, county and wave were selected for black rockfish, blue rockfish, gopher rockfish, and vermilion rockfish and the drift-level index for brown rockfish. The model incorporate in year and county was selected for the trip-level Stephens-MacCall filtered index for brown rockfish and both Stephens-MacCall filtered indices for China rockfish.

In general, the larger increases and decreases in the indices were similar among the four indices developed for each species (Figure 6). The generalized approach used in this paper to create indices with comparable methods resulted in different results for each species. The area-weighted indices are reflective of the total available habitat and use all of the available high resolution habitat and fishing drift data. However, differences among the four indices were different for each species. The average CVs between the drift-level area-weighted index and the drift-level habitat informed indices were similar, as expected, since they both used the same data with the only difference being the year:area interaction in the models (?). However, the average CV between drift-level habitat-informed filtering and Stephens-MacCall filtering for the drift-level data differed by species.

The area-weighting for black rockfish, a species distributed predominantly north of Santa Cruz, California did have an effect on the index for a number of years, most notably in 2013 where the area-weighted estimate is lower than all three other indices(Figure 6a). The effect of the area-weighting is also apparent for black rockfish in 2005, 2007, and 2009.The average CV decreased from the trip-level index (0.671) to to the area-weighted index (0.443) and was lowest overall for the drift-level Stephens-MacCall index (0.364) which also modeled much smaller data with a high proportion of positive catches of black rockfish (?).

Blue rockfish is ubiquitous across the study area and was one of the two species for which the area-weighting at the six most disaggregated regions. The area-weighted index differs from the other three in 2006 with an estimated higher relative abundance and in 2014 with an estimated lower relative abundance. Even during the years from 2009 to 2012 when the estimated relative abundance was low for all of the indices, there were differences among the four trends with the drift-level habitat-informed index estimating the lowest relative abundance.

All four indices for brown rockfish suggested differing trends, with this species having the highest estimated error for both the trip-level and drift-level Stephens-MacCall filtered data (Figure 6c). In ten of the years the area-weighted index estimated a either the largest or smallest relative abundance compared to the other indices. For brown rockfish the two habitat-informed indices were more similar than the Stphens-MacCall filtered data. The average CV for brown rockfish from the Stephens-MacCall filtering was large (0.679) compared to the habitat informed filtering (0.142).

China rockfish is the only species for which the trip-level Stephens-MaCall filtered index had the lowest average coefficient of variation that increased with the the habitat-informed filtering (?). Although the trends among the four indices was similar, this is the only species for which the highest error was consistly estimated for both habiat-informed drift-level indices (Figure 6d). China rockfish is one of the less common species observed in the data with the highest average CPUE from catches the Farallon Islands, which is an overall small percentage of the total habitat (**?**).

The observed trends for gopher rockfish were similar among all indices and the trip-level Stephens-MacCall index had the highest average CV (0.626) compared to the average CVs of less than two from all of the other drift-level indices. China rockfish is the only species for which the trip-level index had the lowest average coefficient of variation, which increased with the the habitat-informed filtering . For all other species, the habitat-informed filtering resulted indices with a lower average CV than the trip-level filtering.

The indices of relative abundance for vermilion rockfish were relatively similar in trends across the time series and (Figure 6f). Vermilion rockfish is the second species for which all six areas of rocky reef habitat remained disaggregated in the models. For vermilion rockfish, while the trends are similar among all four indices, the effect of area-weighting dampens the increase modeled from the habitat-informed drift level data from 2004-2006, where the area-weighting downweighted the relative abundance from the drift-level habitat informed index.

4. Discussion

We demonstrated new methodologies for integrating available high resolution rocky reef habitat data into the the data selection process for a recreational survey. The habitat-informed data filtering provides a method to select samples with effective fishing effort as well as incorporation of weighting the indices of abundance by the area of available rocky reef habitat. We also demonstrated that the area-weighted index does have an effect on the estimate of relative abundance by accounting for variable species density along the coast. We also demonstrated that for the six rockfish species we used as examples the filtering applied to a data set has an effect on the resulting index of abundance, and analysts should consider the distribution of a species and other characteristics when applying the Stephens-MacCall filter to select data for an index of abundance.

Discuss habitat definitions and how we might fine-tune these.

The majority of groundfish species targeted by the CPFV fleet north of Point Conception during the time period of this study all have high associations to rocky habitat. In this case, the Stephens-MacCall method can be considered a proxy for habitat w.hen the species of interest has known associations. This can be expanded in areas where trips are known to target species of interest, but no habitat data are available the proportion of trips encountering the target species could be used as a proxy for habitat. This does not hold for areas where multiple species complexes are targeted on same trip, e.g, a multi-day trip may target large pelagic species and once trip limits are reached, the trip may focus on a secondary target, which is the case for the California CPFV fleet fishing south of Point Conception.

The Stephens-MacCall model was originally developed to approximate habitat for a recreational fisheries data with unknown fishing locations. The onboard observer surveys coupled with the high resolution rocky reef habitat maps remove the uncertainty in both fishing locations and the available habitat. The choice of a threshold value to use from the Stephen-MacCall method has been a topic explored by many (**?** ;) and should continue to be explored. For instance, all of the observations in the onboard observer survey are recorded by trained samplers who should have a high rate of correct identification and is the motivation for retaining all of the samples containing the target species during with the Stephens-MacCall filter.

While the Stephens-MacCall filter is useful in identifying co-occurring or non-occurring species it assumes all effort was exerted in pursuit of a single target species. The targeting of more than one species or species complex ("mixed trips") during a trip can result in co-occurrence of species in the catch that do not truly co-occur in terms of habitat associations informative for an index of abundance. This was clearly shown in the differences between the trip-level Stephens-MacCall filtering that relies on the information gathered from an entire trips to the drift-level Stephens-MacCall filtering that reflects the species encountered at a single location. The differences between the drift-level Stephens MacCall filtered data and the habitat-informed filter illustrate what may represent the habitat preference of individual species. Areas of rocky habitat that were well fished and never observed the target species should be investigated to determine if the appropriate habitat exists in that area, or if other factors such as historical fishing pressure explain the lack of target species catch. China rockfish in particular have a heterogenous distribution with an affinity to high relief habitat (?:). Looking at the number of trips selected between the drift-level Stephens-MacCall filter and the habitat-informed filter, the Stephens MacCall filter (based on the retention of the false negatives) may exclude too many samples that fished in the appropriate habitat, but did not meet the probability threshold (?). The Stephens-MacCall filter may be over-selecting samples where the species was not observed if the target species is less common, e.g., China rockfish, but has a strong positive co-occurrence with a more ubiquitous species, e.g., blue rockfish.

Conceptually, the integration of the habitat data with the onboard observer fishing drift locations provides the most accurate information for filtering the data. The CPUE from the onboard observer survey reflects the local density of the target species as a function of local density, rather than abundance. Given that, using area of available rocky habitat as weights in the indices allows us to approximate abundance and provide the most accurate estimates of uncertainty. Additionally, and index of abundance modeled with the appropriate distribution and changes in density across space provides the best available information to inform stock assessment model. If the uncertainty is underestimated, an analyst has an option to add additional variance to an index of abundance within the stock assessment model, which has the potential to effectively mask the trends in the index.

The differences observed in the indices of abundance and knowledge of species-specific habitat preference will allow us to fine-tune these indices on a species-specific basis. The characteristics and classification of the rocky reef habitat into more specific substrate types, e.g., boulder vs pinnacle, are currently only available for a small fraction of the mapped area. Therefore, all areas of rocky substrate are currently created equal. A number of video surveys have shown habitat associations differ by species and xxxxx, and the weights applied as available habitat may vary by species and be lower than the weights used in this paper. Although we did not exclude data based on the species' distributions from the indices developed here, the habitat-informed filters also allow an analyst to subset the data and exclude areas of rocky reef habitat outside of the species' range. For instance, black rockfish have been observed as far south as Point Conception, but their distribution tapers off south of Santa Cruz, California.

The suite of six species that we modeled in this paper is a concrete example of why habitat is important and also varies among the species. The high proportion of retained drifts across species when using habitat as a data filter indicates that hate majority of drifts occurred over, or very close to, rocky habitat. Both blue and black rockfish have high affinity to rocky habitat, but occur higher off the bottom and are both schooling species. It is not uncommon to have a a drift dominated by blue rockfish in central California, or black rockfish further north. However, the Stephen-MacCall approach does not account for this by modeling presence/absence. Additional factors such as latitude could be included in the logistic regression to inform the Stephens-MacCall model.

The fishery-dependent indices of abundance undergo higher levels of scrutiny during stock assessment reviews due to the nature of the data being driven by fisher behavior. There are a number of key assumptions made when using the onboard observer data in a stock assessment. A key assumption of the onboard observer surveys is that fishing behavior remains the same when samplers are not onboard the vessel. If a captain only fishes particular locations or targets a different suite of species when a sampler is onboard the vessel, additional bias is introduced in the data. An additional source of bias in fishery-dependent data is the change in regulation over time. These can be bag limits, sub bag limits, minimum size, and the change of available habitat. For example, California developed a network of Marine Protected Areas (MPAs) in 2007, that reduced the available rocky reef habitat by approximately 23% to the recreational fleet in the study area. Depth restrictions have also been in place for the recreational fleet since the early 2000s, which were relaxed in 2017 and was the reason we constrained the years modeled for this study.

Versions of the drift-level habitat-informed indices were approved by the Pacific Fisheries Management Council's Science and Statistical Committee for use in the 2013 stock assessments and have been used in the stock assessment process since. Comparisons should not be drawn between the indices presented here and the stock assessment documents as the indices in this paper were simplified to develop direct comparisons among methods. When filtering and modeling the onboard observer data for a stock assessment, additional filtering steps would be taken, such as excluding areas where species are rare, e.g., south of Santa Cruz for black rockfish, inclusion of depth as a covariate in the index of abundance, and an exploration of alternative error distributions. Recent studies have identified the need to investigate the assumptions and uncertainty in relative indices of abundance from visual surveys (Bacheler and Shertzer, 2015; Campbell et al., 2015) and simulation studies (Siegfried et al., 2016), and the same holds true for fishery-dependent surveys like the onboard observer survey.

Additional factors not considered in the simplified models presented here include the fact that the catch from the recreational CPFV fishery is dependent on a number of factors including weather, distance from port, the clientele preferences, angler experience and captain's knowledge. These models also do not account for distance to the nearest port, which has been shown to significantly impact the access to fish as well as historical fishing pressure. Further analyses are underway to explore the fine-scale habitat characteristics that will allow the methods described in this paper to be fine-tuned. We also plan to explore changes in fishing behavior related to management measures and and fisher behavior to explain shifts among target species or how large recruitment events for one species may affect the index of abundance for another species.

5. Acknowledgements

CDFW for the the onboard observer data Cal Poly for the collection of the supplemental data

6. Tables

Table 1: Area of rocky habitat in state waters aggregated to the levels modelled for each species. The merged cells for each species indicate which areas of rocky habitat were aggregated to ensure appropriate samples sizes to explore an area-weighted index.

<table>
<tr><th>Rocky Reef Desginations</th><th>Blue rockfish & Vermilion rockfish</th><th>Black rockfish</th><th>Brown rockfish</th><th>China rockfish</th><th>Gopher rockfish</th></tr>
<tr><td>California border to San Francisco</td><td>439.546</td><td>439.546</td><td>439.546</td><td rowspan="2">547.970</td><td rowspan="4">735.825</td></tr>
<tr><td>San Francisco to Santa Cruz</td><td>108.424</td><td>108.424</td><td rowspan="2">498.967</td></tr>
<tr><td>Farallon Islands</td><td>50.252</td><td rowspan="4">390.543</td><td>50.252</td></tr>
<tr><td>Moss Landing to Big Sur</td><td>137.603</td><td rowspan="2">228.027</td><td>137.603</td></tr>
<tr><td>Big Sur to Morro Bay</td><td>90.424</td><td rowspan="2">202.688</td><td>90.424</td></tr>
<tr><td>Morro Bay to Point Conception</td><td>112.264</td><td>112.264</td><td>112.264</td></tr>
</table>

Table 2: The number of samples retained after filtering to create the index of abundance with the percent of samples that caught the species in parentheses.

	Drift-level		Trip-level
Species	Habitat-informed	Stephens-MacCall filtered	Stephens-MacCall filtered
Black Rockfish	16306 (16%)	4891 (56%)	919 (75%)
Blue Rockfish	15283 (44%)	10445 (70%)	1962 (92%)
Brown Rockfish	15736 (16%)	4717 (61%)	1104 (73%)
China Rockfish	14865 (8%)	2356 (55%)	1160 (70%)
Gopher Rockfish	14476 (31%)	7788 (65%)	1700 (84%)
Vermilion Rockfish	14713 (30%)	7415 (62%)	1849 (87%)

Table 3: The average Coefficient of Variation (CV) for each index of abundance, where SM-filtered is the Stephens-MacCall filtering.

	Drift-level			Trip-level
Species	Area-weighted	Habitat-informed	Stephens-MacCall filtered	Stephens-MacCall filtered
Black rockfish	0.443	0.449	0.364	0.671
Blue rockfish	0.134	0.142	0.099	0.257
Brown rockfish	0.242	0.240	0.679	0.858
China rockfish	0.320	0.301	0.233	0.151
Gopher rockfish	0.179	0.183	0.138	0.626
Vermilion rockfish	0.152	0.178	0.133	0.238

547 # 7. Figures

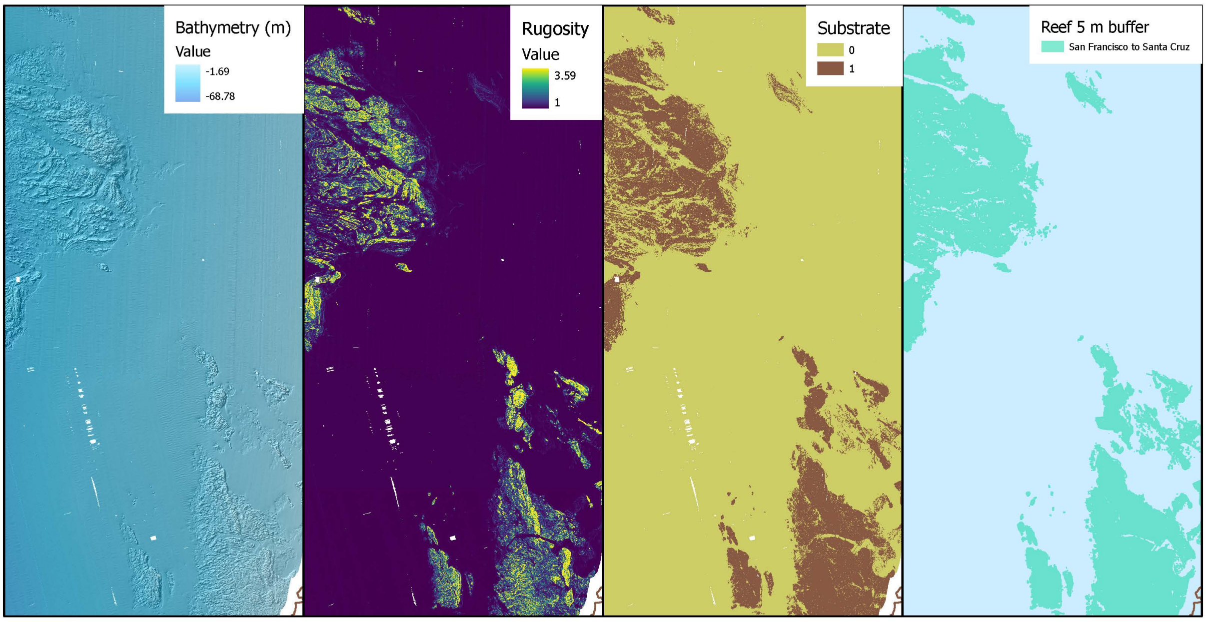


Figure 1: A example of the high resolution bathymetric data and components of bathymetry and rugosity used to define rough versus smooth substrate (where hard substrate is denoted by 1). The far right panel displays the hard substrate with the added 5 m buffer to represent the rocky reef habitat.

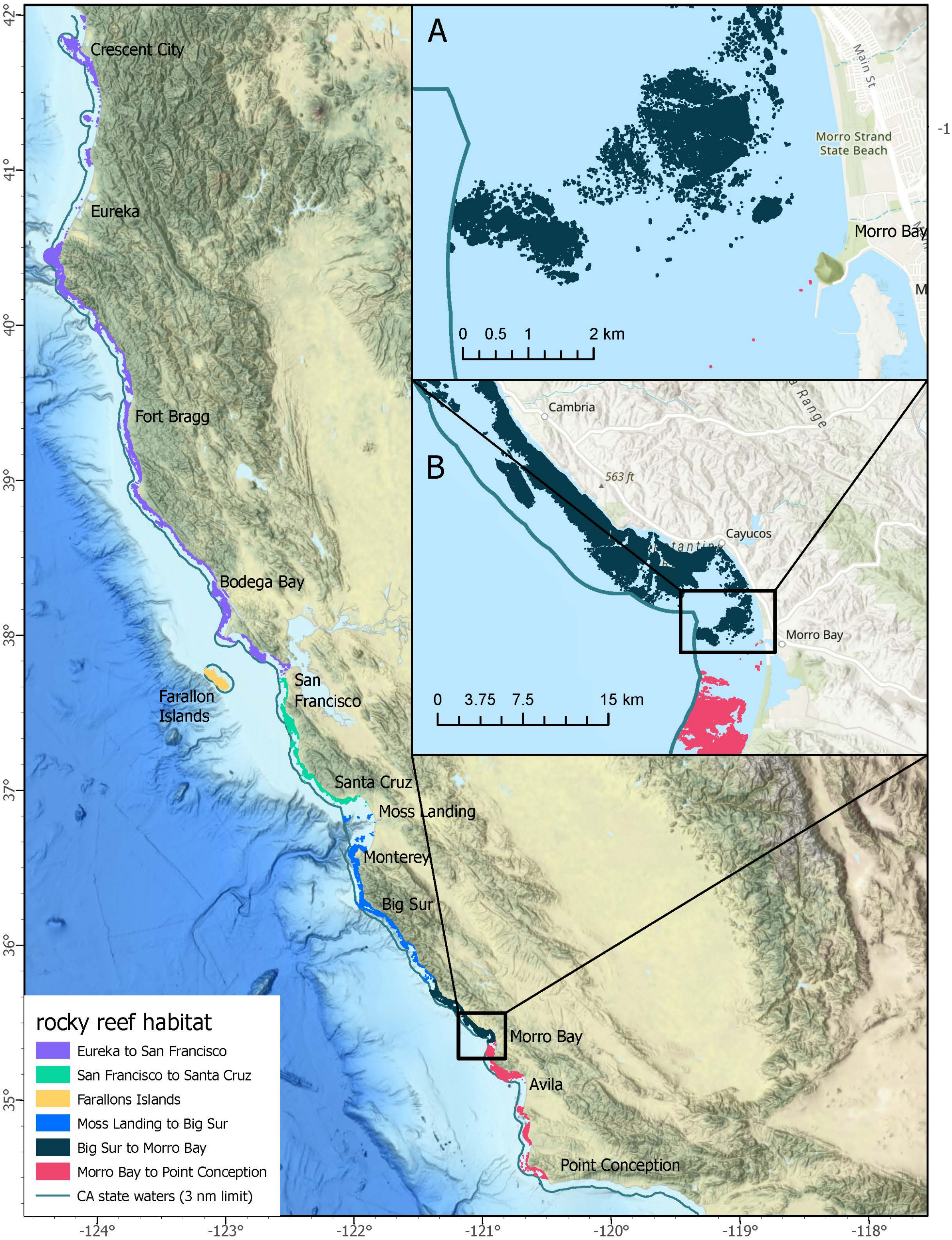


Figure 2: A maps of California state waters north of Point Conception colored by the aggregated areas of rocky reef habitat, including inset A depicting the rocky reef habitat in relation to 3 nm state water boundary state waters and inset B showing the high resolution rocky habitat in the area.

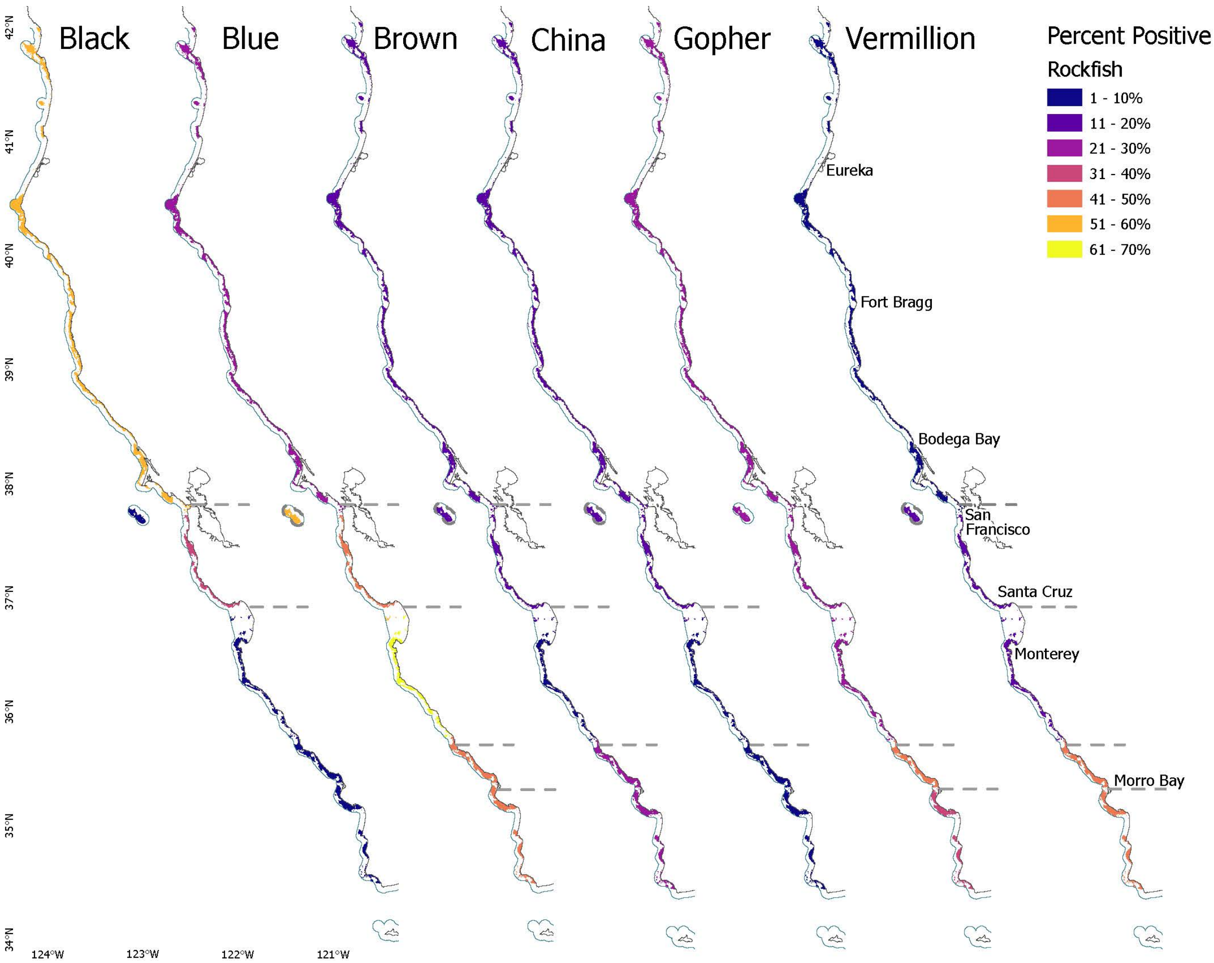


Figure 3: The percent of drifts that retained the target species, within grouped areas of rocky habitat over all years of the time series. The grey dashed lines represent the aggregated rocky habitat used to develop an index of abundance.

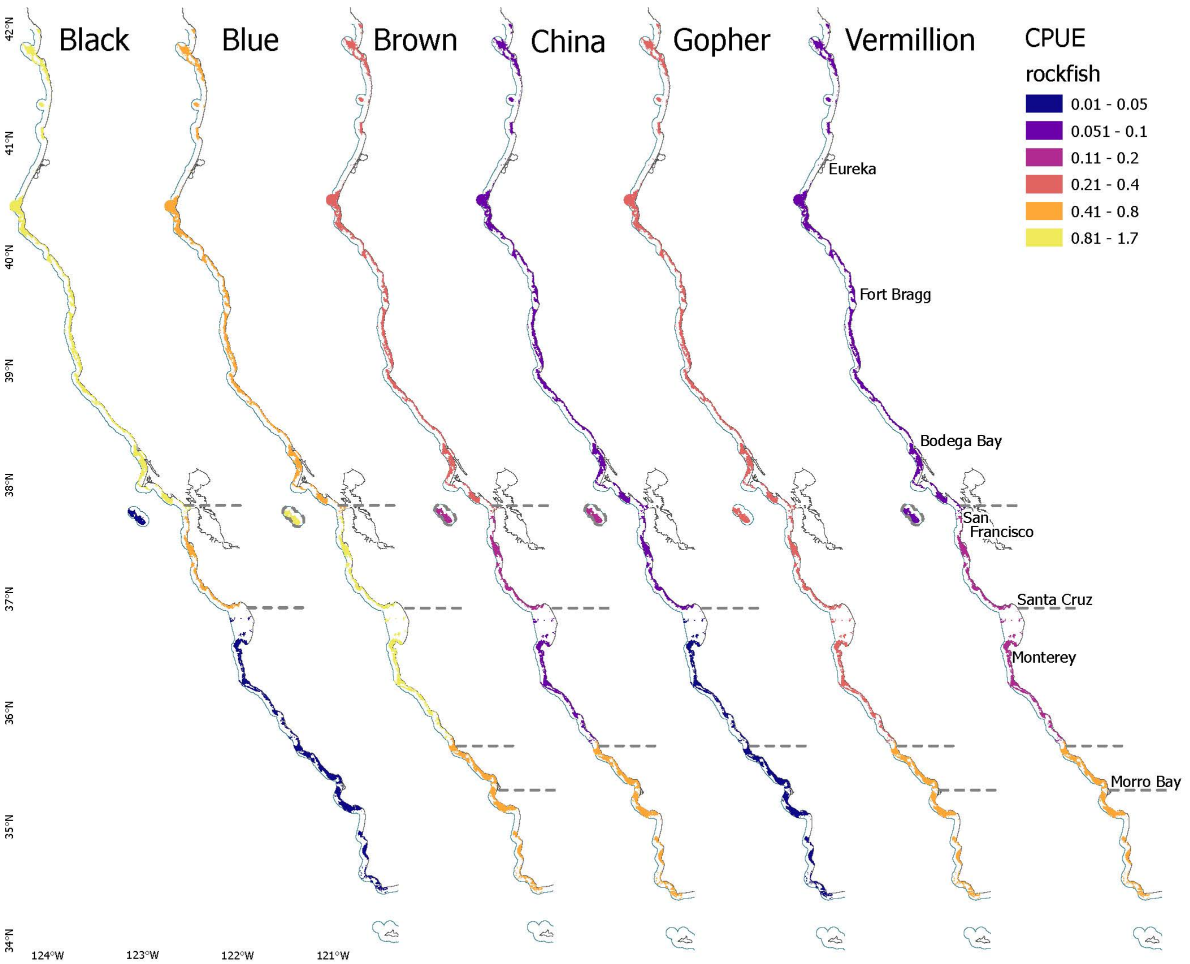
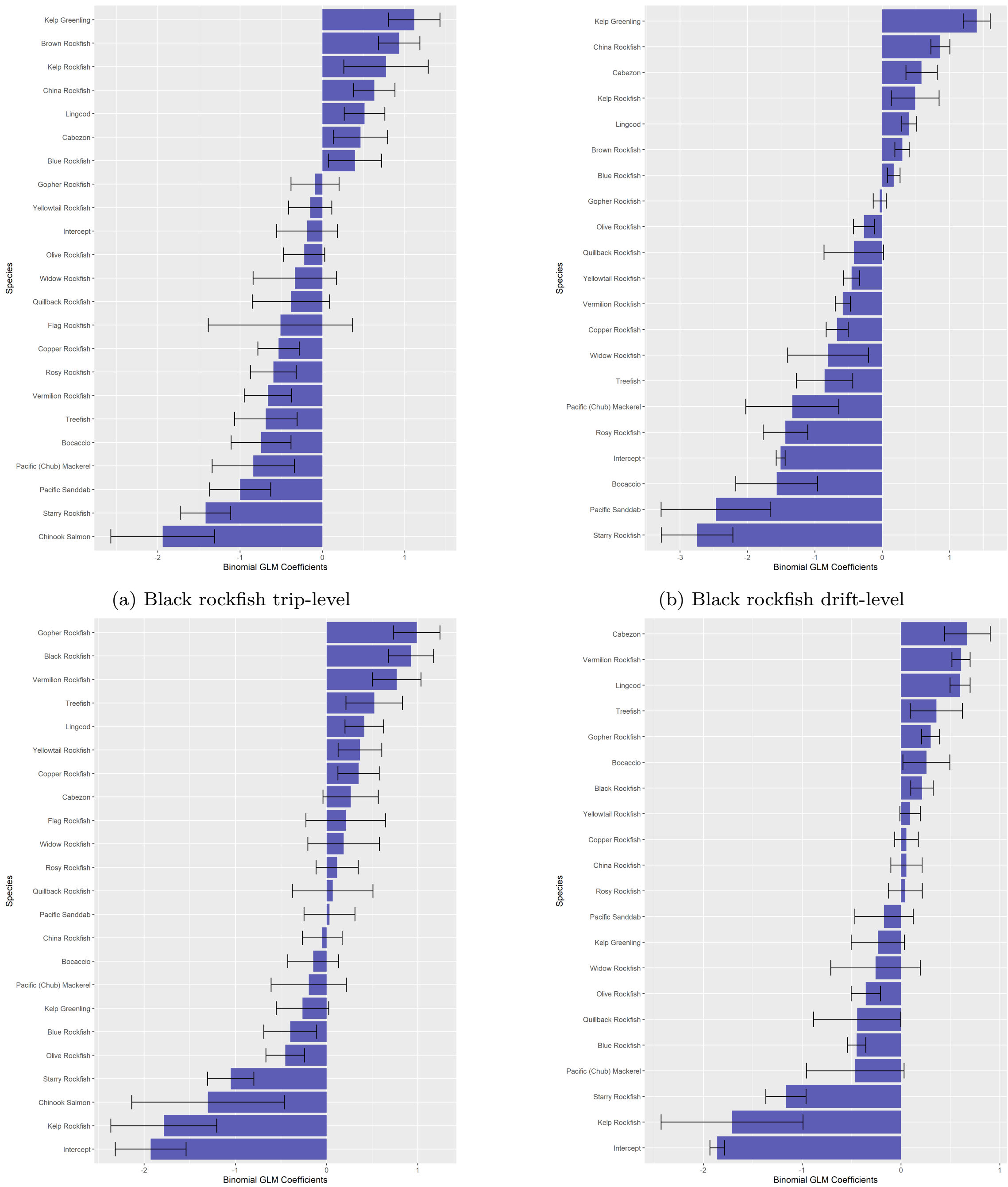


Figure 4: The average CPUE across all years of the time series for each of the six species. The grey dashed lines represent the aggregated rocky habitat used to develop an index of abundance.



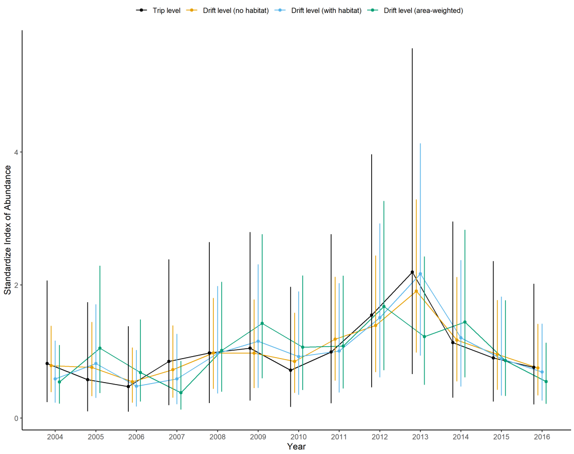
(a) Black rockfish trip-level

(b) Black rockfish drift-level

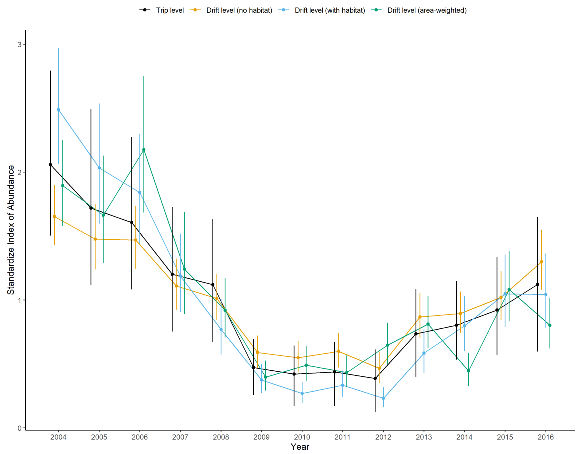
(c) Brown rockfish trip-level

(d) Brown rockfish drift-level

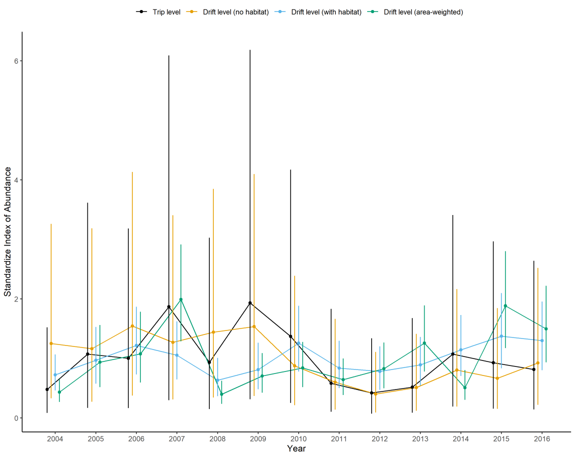
Figure 5: Examples of the species coefficients and 95% confidence intervals for the Stephens-MacCall filtering for black rockfish and brown rockfish for the trip-level and drift-level data.



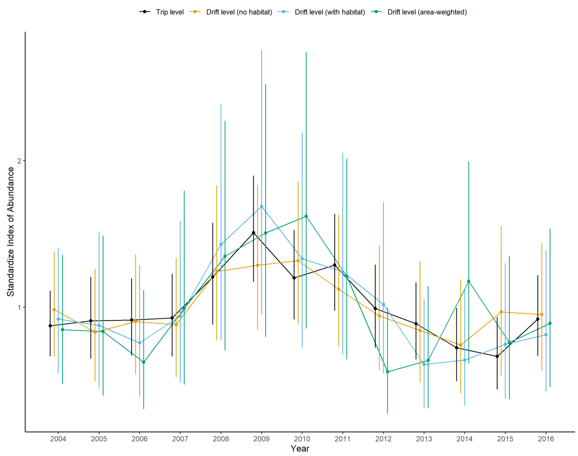
(a) Black rockfish



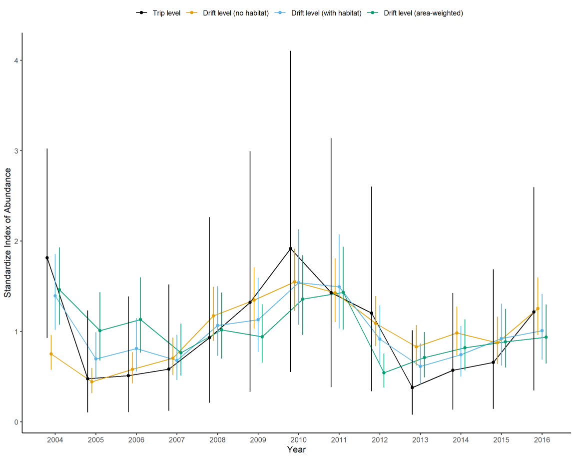
(b) Blue rockfish



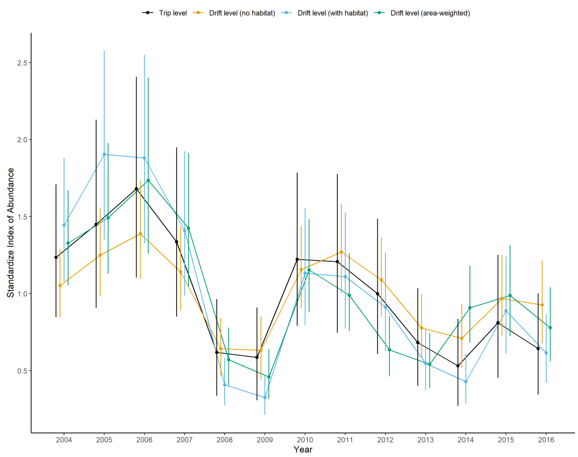
(c) Brown rockfish



(d) China rockfish



(e) Gopher rockfish



(f) Vermilion rockfish

Figure 6: Indices of abundance and 95% confidence intervals, each scaled to its mean, for the six species.

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