# Density Model for Harbor Porpoise (*Phocoena phocoena*) for the U.S. Navy Atlantic Fleet Testing and Training (AFTT) Study Area: Supplementary Report

Model Version 3

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# **Citation**

When referencing our methodology or results generally, please cite Roberts et al. (2023), which documented the modeling cycle we completed in the 2022 for the U.S. Navy AFTT Phase IV Environmental Impact Statement, and Mannocci et al. (2017), which developed the original methodology and models upon which the 2022 models were based. The full citations appear in the References section at the end of this document.

To independently reference this specific model or Supplementary Report, please cite:

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## **Model Version History**



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## **1 Survey Data**

Following Mannocci et al. (2017), whose model we were updating, we built this model from data collected in the east coast and Caribbean and excluded surveys of the Gulf of Mexico, Europe, and the Mid-Atlantic Ridge for the reasons mentioned by those authors. We did include segments south of 50 °N and west of 40 °W from a trans-Atlantic survey by  $R/V$  Song of the Whale. Harbor porpoises are small, cryptic odontocetes that are difficult to detect from long distances or in poor conditions. Accordingly, we excluded all surveys that did not target harbor porpoises as well as aerial surveys flown at altitudes higher than 750 ft., which species experts within our collaboration determined was the maximum altitude they were likely to be reliably detected without a belly observer or belly camera. Although detections at higher altitudes are possible, we lacked the counts needed to fit detection functions unless we pooled surveys flown at lower altitudes, which species experts determined would be inappropriate. Consistent with our regional models for the east coast, we restricted this model to survey transects collected in sea states of Beaufort 2 or less. We also excluded transects with poor weather or visibility for surveys that reported those conditions. Table [1](#page-1-0) summarizes the survey effort and sightings available for the model after most exclusions were applied. Figure [1](#page-3-0) shows the data actually used to fit the model.

<span id="page-1-0"></span>Table 1: Survey effort and observations considered for this model. Effort is tallied as the cumulative length of on-effort transects. Observations are the number of groups and individuals encountered while on effort. Off effort observations and those lacking an estimate of group size or distance to the group were excluded.



Table 2: Institutions that contributed surveys used in this model.





Table 3: Descriptions and references for survey programs used in this model.

# **2 Density Model**

Our objective was to update the model of Mannocci et al. (2017) with new data without repeating the covariate selection exercise performed by those authors. We therefore fitted a year-round, 4-covariate model that included depth, micronekton productivity, zooplankton biomass, and the standard deviation of sea surface height anomaly. The resulting relationships (Figure [2\)](#page-5-0) generally resembled those of Mannocci et al.'s model (but see discussion in Section [4\)](#page-17-0). Model predictions are shown in Section [3.](#page-16-0) Univariate extrapolation analyses (Section [2.3.1\)](#page-11-0) displayed geographic patterns very similar to the environmental envelopes estimated by Mannocci et al. Little environmental extrapolation was necessary, and was driven mainly by a lack of sampling in waters with a very low or very high standard deviation of sea level anomaly, as were found sporadically in the Labrador Sea and shelf (very low values) and in the Gulf Stream (very high values) (Figure [11\)](#page-14-0).

## **2.1 Final Model**

<span id="page-3-0"></span>

Figure 1: Survey segments (black lines) used to fit the model for the region AFTT Atlantic. Red points indicate segments with observations. This map uses a Web Mercator projection but the analysis was conducted in an Albers Equal Area coordinate system appropriate for density modeling.

Statistical output for this model:

Family: Tweedie(p=1.387) Link function: log

Formula:

IndividualsCorrected ~ offset(log(SegmentArea)) + s(log10(Depth), bs = "ts", k = 4) + s(sqrt(pmin(EpiMnkPP, 0.35)), bs = "ts",  $k = 4$ ) + s(sqrt(pmin(PkPB, 50)), bs = "ts",  $k = 4$ ) + s(log10(SLAStDev),  $bs = "ts", k = 4)$ Parametric coefficients: Estimate Std. Error t value Pr(>|t|) (Intercept) -19.008 0.188 -101.1 <2e-16 \*\*\* --- Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1 Approximate significance of smooth terms: edf Ref.df F p-value s(log10(Depth)) 2.960 3 62.65 <2e-16 \*\*\* s(sqrt(pmin(EpiMnkPP, 0.35))) 2.897 3 70.76 <2e-16 \*\*\* s(sqrt(pmin(PkPB, 50))) 2.910 3 227.29 <2e-16 \*\*\* s(log10(SLAStDev)) 1.088 3 14.70 <2e-16 \*\*\* --- Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1  $R-sq.(adj) = 0.0581$  Deviance explained = 32.8% -REML = 9476 Scale est. = 14.922 n = 29624 Method: REML Optimizer: outer newton full convergence after 12 iterations. Gradient range [-1.707415e-05,2.062844e-05] (score 9475.994 & scale 14.92173). Hessian positive definite, eigenvalue range [0.1465804,4556.89]. Model rank = 13 / 13 Basis dimension (k) checking results. Low p-value (k-index<1) may indicate that k is too low, especially if edf is close to k'. k' edf k-index p-value s(log10(Depth)) 3.00 2.96 0.76 <2e-16 \*\*\* s(sqrt(pmin(EpiMnkPP, 0.35))) 3.00 2.90 0.80 0.055 . s(sqrt(pmin(PkPB, 50))) 3.00 2.91 0.77 <2e-16 \*\*\* s(log10(SLAStDev)) 3.00 1.09 0.81 0.340 --- Signif. codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

<span id="page-5-0"></span>

Figure 2: Functional plots for the final model for the region AFTT Atlantic. Transforms and other treatments are indicated in axis labels.  $log10$  indicates the covariate was  $log_{10}$  transformed. *sqrt* indicates the covariate was square-root transformed. *pmax* and *pmin* indicate the covariate's minimum and maximum values, respectively, were Winsorized to the values shown. Winsorization was used to prevent runaway extrapolations during prediction when covariates exceeded sampled ranges, or for ecological reasons, depending on the covariate. */1000* indicates meters were transformed to kilometers for interpretation convenience.



Table 4: Covariates used in the final model for the region AFTT Atlantic.



Figure 3: Residual plots for the final model for the region AFTT Atlantic.

<span id="page-7-0"></span>

Figure 4: Density histograms showing the distributions of the covariates considered during the final model selection step. The final model may have included only a subset of the covariates shown here (see Figure [2\)](#page-5-0), and additional covariates may have been considered in preceding selection steps. Red and blue lines enclose 99% and 95% of the distributions, respectively. Transforms and other treatments are indicated in axis labels.  $log10$  indicates the covariate was  $log_{10}$  transformed. *pmax* and *pmin* indicate the covariate's minimum and maximum values, respectively, were Winsorized to the values shown. Winsorization was used to prevent runaway extrapolations during prediction when covariates exceeded sampled ranges, or for ecological reasons, depending on the covariate. */1000* indicates meters were transformed to kilometers for interpretation convenience.



Figure 5: Density histograms shown in Figure [4](#page-7-0) replotted without Winsorization, to show the full range of sampling represented by survey segments.



Figure 6: Scatterplot matrix of the covariates considered during the final model selection step. The final model may have included only a subset of the covariates shown here (see Figure [2\)](#page-5-0), and additional covariates may have been considered in preceding selection steps. Covariates are transformed and Winsorized as shown in Figure [4.](#page-7-0) This plot is used to check simple correlations between covariates (via pairwise Pearson coefficients above the diagonal) and visually inspect for concurvity (via scatterplots and red lowess curves below the diagonal).

#### sqrt(pmin(EpiMnkPP, 0.35))

#### log10(Depth)



Figure 7: Dotplot of the covariates considered during the final model selection step. The final model may have included only a subset of the covariates shown here (see Figure [2\)](#page-5-0), and additional covariates may have been considered in preceding selection steps. Covariates are transformed and Winsorized as shown in Figure [4.](#page-7-0) This plot is used to check for suspicious patterns and outliers in the data. Points are ordered vertically by segment ID, sequentially in time.

## **2.3 Extrapolation Diagnostics**

#### <span id="page-11-0"></span>**2.3.1 Univariate Extrapolation**



log10(Depth) Mean NT1 statistic across all time slices

Figure 8: NT1 statistic (Mesgaran et al. (2014)) for static covariates used in the model for the region AFTT Atlantic. Areas outside the sampled range of a covariate appear in color, indicating univariate extrapolation of that covariate occurred there. Areas within the sampled range appear in gray, indicating it did not occur.



Figure 9: NT1 statistic (Mesgaran et al. (2014)) for the EpiMnkPP covariate in the model for the region AFTT Atlantic. Areas outside the sampled range of a covariate appear in color, indicating univariate extrapolation of that covariate occurred there during the month. Areas within the sampled range appear in gray, indicating it did not occur.



Figure 10: NT1 statistic (Mesgaran et al. (2014)) for the PkPB covariate in the model for the region AFTT Atlantic. Areas outside the sampled range of a covariate appear in color, indicating univariate extrapolation of that covariate occurred there during the month. Areas within the sampled range appear in gray, indicating it did not occur.

<span id="page-14-0"></span>

Figure 11: NT1 statistic (Mesgaran et al. (2014)) for the SLAStDev covariate in the model for the region AFTT Atlantic. Areas outside the sampled range of a covariate appear in color, indicating univariate extrapolation of that covariate occurred there during the month. Areas within the sampled range appear in gray, indicating it did not occur.

#### **2.3.2 Multivariate Extrapolation**



Figure 12: ExDet statistic (Mesgaran et al. (2014)) for all of the covariates used in the model for the region AFTT Atlantic. Areas in orange (ExDet < 0) required univariate extrapolation of one or more covariates (see previous section). Areas in purple  $(ExDet > 1)$ , did not require univariate extrapolation but did require multivariate extrapolation, by virtue of having novel combinations of covariates not represented in the survey data, according to the NT2 statistic (Mesgaran et al. (2014)). Areas in green ( $0 \geq$  ExDet  $\leq$  1) did not require either type of extrapolation.

# <span id="page-16-0"></span>**3 Predictions**

### **3.1 Summarized Predictions**

<span id="page-16-1"></span>

Figure 13: Survey effort and observations (top left), predicted density with observations (top right), predicted density without observations (bottom right), and coefficient of variation of predicted density (bottom left), for the given era. Variance was estimated with the analytic approach given by Miller et al. (2022), Appendix S1, and accounts both for uncertainty in model parameter estimates and for temporal variability in dynamic covariates. These maps use a Web Mercator projection but the analysis was conducted in an Albers Equal Area coordinate system appropriate for density modeling.

## **3.2 Comparison to Previous Density Model**

<span id="page-17-1"></span>

Figure 14: Comparison of the mean density predictions from the previous model (left) released by Mannocci et al. (2017) to those from this model (right). These maps use a Web Mercator projection but the analysis was conducted in an Albers Equal Area coordinate system appropriate for density modeling.

# <span id="page-17-0"></span>**4 Discussion**

Following Mannocci et al. (2017), we summarized this model into a single year-round mean density surface (Figure [13\)](#page-16-1). Although our figures show predictions for the entire AFTT study area, we recommend that the regional East Coast (EC) model be used for the waters it covers, and that the AFTT model be used only for waters outside that region. The EC model provides predictions as 12 monthly means, rather than a single year-round mean. Harbor porpoises are absent in the Gulf of Mexico, so no regional model was fitted there. See Roberts et al. (2023) for more discussion of the models.

The predictions generally accorded with what has been reported in the literature and strongly resembled the predictions of Mannocci et al. (2017) for the continental shelf but estimated much lower density beyond the shelf, leading to to a total abundance estimate that was about 55% lower (Figure [14\)](#page-17-1). The predictions of harbor porpoise presence along the shelf of Newfoundland and Labrador were supported by sightings reported by aerial surveys in 2007 and 2015 (Lawson and Gosselin 2009, 2011, 2018). The predictions of presence along the shelf of west Greenland were supported by sightings reported by aerial surveys there in 2007 (Hansen and Heide-Jørgensen 2013). None of these surveys were available for use in our model; future updates would benefit from their inclusion. Please see the harbor porpoise report from Mannocci et al. (2017) for additional discussion of the literature.

The differing predictions beyond the continental shelf are a concern. The difference was driven by the relationship fitted to the depth covariate. In Mannocci et al. (2017), depth showed a positive effect on density in waters deeper than about 1000  $m$  (about 3.0 in log<sub>10</sub> scale), but in our model remained negative throughout this range. Our model benefited from additional off-shelf shipboard surveys, mainly from NOAA AMAPPS and MCR (Table [1\)](#page-1-0). Nearly all of the sightings reported by these surveys were made on transects that occurred over the shelf or at the shelf break. This additional absence data beyond the shelf drove down the depth relationship there, yielding lower predicted densities. Despite this additional data—which, in principle, reduces uncertainty about porpoise density beyond the shelf—we advise caution in northern off-shelf waters such as the Labrador Sea, as none of the surveys occurred there and model predictions represent a geographical extrapolation. At the time of this writing, the OBIS-SEAMAP archive (Halpin et al. 2009) reported several sightings in off-shelf waters there.

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