

Table 1. a) Development of binomial GAMM models ranked by increasing AIC. b) GAM summary table for the final model\*. c) Output from gam.check evaluating the basis dimensions of smoothing splines.

| a)<br>Model  | Residual<br>deviance | % deviance<br>explained | Dispersion | AIC   | logLik | deltaAIC |
|--|----------------------|-------------------------|------------|-------|--------|----------|
| s(Survey, bs="re", by=dum)+offset(logAreasw)+ s(solar altitude,<br>by=Survey, bs="cc")+ te(x.utm, y.utm,yr, by=season, bs="cs")* | 10203                | 40                      | 0.912      | 10403 | -5102  | 0        |
| s(Survey, bs="re", by=dum)+offset(logAreasw)+ s(solar altitude,<br>by=Survey, bs="cc")+ te(x.utm, y.utm, year, bs="cs")          | 11590                | 32                      | 1.022      | 11806 | -5795  | 1402     |
| s(Survey, bs="re", by=dum)+offset(logAreasw)+ s(solar altitude,<br>by=Survey, bs="cc")+ te(x.utm, y.utm, bs="cs")                | 12395                | 27                      | 1.134      | 12474 | -6198  | 2071     |
| s(Survey, bs="re", by=dum)+offset(logAreasw)+ s(solar altitude,<br>by=Survey, bs="cc")   | 14561                | 14.                     | 0.993      | 14618 | -7280  | 4215     |
| s(Survey, bs="re", by=dum)+offset(logAreasw)+ s(solar<br>altitude,bs="cc")   | 14969                | 12                      | 1.020      | 14992 | -7485  | 4589     |
| s(Survey, bs="re", by=dum)+offset(logAreasw)   | 15095                | 11                      | 1.008      | 15103 | -7548  | 4700     |
| s(Survey, bs="re", by=dum)   | 15128                | 14                      | 0.998      | 15136 | -7564  | 4732     |
| ~1   | 17631                | 0.000                   | 1.000      | 17633 | -8815  | 7229     |

Table 1b) Summary table for the final binomial GAMM model.

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Family: binomial
Link function: logit
Formula:
Total.Count > 0 ~ s(Survey, bs = "re", by = dum) + offset(logAreasw) +
  s(altitude, by = Survey, bs = "cc") + te(x.utm, y.utm, yr,
  by = seas, bs = "cs")
Parametric coefficients:
              Estimate Std. Error z value Pr(>|z|)
(Intercept) -7.6413      0.3943  -19.38  <2e-16 ***
---
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Approximate significance of smooth terms:
              edf Ref.df   Chi.sq  p-value
s(Survey):dum      2.48903      3    97.854 < 2e-16 ***
s(altitude):SurveyCAN  0.06538      8     0.062  0.378
s(altitude):SurveyMENH 3.57539      8   103.149 1.02e-06 ***
s(altitude):SurveyNEAMAP 5.30534      8   176.406 2.45e-05 ***
s(altitude):SurveyNEFSC 5.76999      8    60.908 1.33e-12 ***
te(x.utm,y.utm,yr):seas 87.46750    125 12840.763 < 2e-16 ***
---
Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

R-sq.(adj) = 0.494  Deviance explained = 44.4%
-REML = 6982.6  Scale est. = 1          n = 20877

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Table 1c) Evaluation of adequacy of basis dimensions of the final binomial GAMM

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Method: REML   Optimizer: outer newton
full convergence after 9 iterations.
Gradient range [-0.002734402,0.0002251932]
(score 6982.594 & scale 1).
Hessian positive definite, eigenvalue range [0.003774754,12.20726].
Model rank = 162 / 162
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(Survey):dum      4.0000  2.4890      NA      NA
s(altitude):SurveyCAN  8.0000  0.0654  1.01  0.82
s(altitude):SurveyMENH  8.0000  3.5754  1.01  0.84
s(altitude):SurveyNEAMAP  8.0000  5.3053  1.01  0.84
s(altitude):SurveyNEFSC  8.0000  5.7700  1.01  0.86
te(x.utm,y.utm,yr):seas 125.0000 87.4675  0.88 <2e-16 ***
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Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

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Table 2. Availability estimates for the fishery ( $v_{\text{fishery}}$ ) and NEFSC survey ( $v_{\text{survey}}$ ) strata used to develop abundance indices for *Illex*. Area ( $\text{km}^2$ ) calculations were developed using the species distribution model predictions (+/-SE) classified with the sensitivity-specificity threshold (0.29; sens-spec) and the negative and positive predicted value threshold (0.7; Pred.value) for probability of occupancy. Availability estimates are ratios of the area of overlap of the fishery or survey with the species distribution divided by the species distribution area.  $V_{\text{fishery}}$  was evaluated using only summer/fall projections of the SDM. The survey area included offshore strata 1-30, 350, 351, 36-40 and 61-76 and was estimated to be 209,670 $\text{km}^2$  when rasterized onto the analysis grid.

| Year      | Season | Grid used     | Species distribution Area at threshold |             |              | $v_{\text{fishery}}$ at threshold |             | $v_{\text{survey}}$ at threshold |           |
|-----------|--------|---------------|--|-------------|--------------|-----------------------------------|-------------|----------------------------------|-----------|
|           |        |               | sens-spec                              | pred. value | Fishery Area | sens-spec                         | pred. value | sens-spec                        | Pred. val |
| 2008 fall |        | prediction    | 399587                                 | 179461      | 671          | 0.002                             | 0.003       | 0.378                            | 0.320     |
| 2008 fall |        | prediction-SE | 374522                                 | 130085      | 671          | 0.002                             | 0.004       | 0.383                            | 0.309     |
| 2008 fall |        | prediction+SE | 415643                                 | 221088      | 671          | 0.002                             | 0.003       | 0.376                            | 0.331     |
| 2009 fall |        | prediction    | 421661                                 | 248982      | 807          | 0.002                             | 0.003       | 0.366                            | 0.331     |
| 2009 fall |        | prediction-SE | 409793                                 | 214078      | 807          | 0.002                             | 0.003       | 0.366                            | 0.328     |
| 2009 fall |        | prediction+SE | 433033                                 | 289335      | 807          | 0.002                             | 0.002       | 0.363                            | 0.327     |
| 2010 fall |        | prediction    | 445781                                 | 336396      | 1077         | 0.003                             | 0.003       | 0.351                            | 0.315     |
| 2010 fall |        | prediction-SE | 433469                                 | 293697      | 1077         | 0.003                             | 0.004       | 0.353                            | 0.327     |
| 2010 fall |        | prediction+SE | 456394                                 | 373357      | 1077         | 0.002                             | 0.003       | 0.349                            | 0.309     |
| 2011 fall |        | prediction    | 447147                                 | 324606      | 1681         | 0.004                             | 0.005       | 0.352                            | 0.351     |
| 2011 fall |        | prediction-SE | 423960                                 | 296407      | 1681         | 0.004                             | 0.006       | 0.364                            | 0.358     |
| 2011 fall |        | prediction+SE | 466261                                 | 355279      | 1681         | 0.004                             | 0.005       | 0.345                            | 0.343     |
| 2012 fall |        | prediction    | 420497                                 | 287890      | 941          | 0.002                             | 0.003       | 0.377                            | 0.400     |
| 2012 fall |        | prediction-SE | 401754                                 | 251965      | 941          | 0.002                             | 0.004       | 0.387                            | 0.427     |
| 2012 fall |        | prediction+SE | 438420                                 | 316806      | 941          | 0.002                             | 0.003       | 0.367                            | 0.386     |
| 2013 fall |        | prediction    | 387264                                 | 217287      | 1273         | 0.003                             | 0.005       | 0.409                            | 0.488     |
| 2013 fall |        | prediction-SE | 355717                                 | 148844      | 1273         | 0.004                             | 0.006       | 0.436                            | 0.621     |
| 2013 fall |        | prediction+SE | 409291                                 | 257392      | 1273         | 0.003                             | 0.005       | 0.394                            | 0.467     |
| 2014 fall |        | prediction    | 351749                                 | 165228      | 1344         | 0.004                             | 0.006       | 0.452                            | 0.576     |
| 2014 fall |        | prediction-SE | 334468                                 | 115957      | 1344         | 0.004                             | 0.008       | 0.464                            | 0.732     |
| 2014 fall |        | prediction+SE | 379306                                 | 213609      | 1344         | 0.004                             | 0.005       | 0.427                            | 0.508     |
| 2015 fall |        | prediction    | 356950                                 | 187719      | 1133         | 0.003                             | 0.005       | 0.448                            | 0.505     |
| 2015 fall |        | prediction-SE | 342476                                 | 152666      | 1133         | 0.003                             | 0.006       | 0.455                            | 0.553     |
| 2015 fall |        | prediction+SE | 373049                                 | 216506      | 1133         | 0.003                             | 0.005       | 0.438                            | 0.499     |

Table 2 continued

| Year | Season | Grid used     | Species distribution Area at threshold |             | Fishery Area | $v_{\text{fishery}}$ at threshold |             | $v_{\text{survey}}$ at threshold |           |
|------|--------|---------------|--|-------------|--------------|-----------------------------------|-------------|----------------------------------|-----------|
|      |        |               | sens-spec                              | pred. value |              | sens-spec                         | pred. value | sens-spec                        | pred. val |
| 2016 | fall   | prediction    | 392977                                 | 228367      | 1609         | 0.004                             | 0.007       | 0.412                            | 0.454     |
| 2016 | fall   | prediction-SE | 366041                                 | 204391      | 1609         | 0.005                             | 0.008       | 0.428                            | 0.455     |
| 2016 | fall   | prediction+SE | 435218                                 | 255273      | 1609         | 0.004                             | 0.006       | 0.383                            | 0.446     |
| 2017 | fall   | prediction    | 446634                                 | 301059      | 3065         | 0.007                             | 0.010       | 0.369                            | 0.367     |
| 2017 | fall   | prediction-SE | 420387                                 | 271433      | 3065         | 0.008                             | 0.011       | 0.379                            | 0.376     |
| 2017 | fall   | prediction+SE | 467649                                 | 344111      | 3065         | 0.007                             | 0.009       | 0.362                            | 0.347     |
| 2018 | fall   | prediction    | 468022                                 | 372255      | 3656         | 0.008                             | 0.010       | 0.358                            | 0.319     |
| 2018 | fall   | prediction-SE | 451118                                 | 354294      | 3656         | 0.008                             | 0.011       | 0.361                            | 0.313     |
| 2018 | fall   | prediction+SE | 479915                                 | 393899      | 3656         | 0.008                             | 0.009       | 0.356                            | 0.323     |
| 2019 | fall   | prediction    | 471067                                 | 396878      | 2795         | 0.006                             | 0.007       | 0.360                            | 0.321     |
| 2019 | fall   | prediction-SE | 455468                                 | 377763      | 2795         | 0.006                             | 0.007       | 0.359                            | 0.309     |
| 2019 | fall   | prediction+SE | 483185                                 | 418723      | 2795         | 0.006                             | 0.006       | 0.360                            | 0.328     |
| 2008 | spring | prediction    | 54794                                  | 11368       |              |                                   |             | 0.205                            | 0.141     |
| 2008 | spring | prediction-SE | 36130                                  | 6781        |              |                                   |             | 0.210                            | 0.118     |
| 2008 | spring | prediction+SE | 73442                                  | 18435       |              |                                   |             | 0.230                            | 0.145     |
| 2009 | spring | prediction    | 53867                                  | 4406        |              |                                   |             | 0.298                            | 0.121     |
| 2009 | spring | prediction-SE | 36393                                  | 3071        |              |                                   |             | 0.313                            | 0.022     |
| 2009 | spring | prediction+SE | 68868                                  | 7716        |              |                                   |             | 0.291                            | 0.147     |
| 2010 | spring | prediction    | 42042                                  | 3669        |              |                                   |             | 0.530                            | 0.018     |
| 2010 | spring | prediction-SE | 35802                                  | 2468        |              |                                   |             | 0.475                            | 0.027     |
| 2010 | spring | prediction+SE | 54849                                  | 5990        |              |                                   |             | 0.492                            | 0.089     |
| 2011 | spring | prediction    | 47700                                  | 6123        |              |                                   |             | 0.576                            | 0.109     |
| 2011 | spring | prediction-SE | 41451                                  | 4331        |              |                                   |             | 0.528                            | 0.046     |
| 2011 | spring | prediction+SE | 54261                                  | 8576        |              |                                   |             | 0.604                            | 0.148     |
| 2012 | spring | prediction    | 50385                                  | 10250       |              |                                   |             | 0.599                            | 0.254     |
| 2012 | spring | prediction-SE | 45579                                  | 8329        |              |                                   |             | 0.564                            | 0.256     |
| 2012 | spring | prediction+SE | 54787                                  | 12432       |              |                                   |             | 0.625                            | 0.263     |
| 2013 | spring | prediction    | 51499                                  | 14177       |              |                                   |             | 0.608                            | 0.348     |
| 2013 | spring | prediction-SE | 46237                                  | 11728       |              |                                   |             | 0.573                            | 0.358     |

Table 2 continued

| Year | Season | Grid used     | Species distribution Area at threshold |             |              | $v_{\text{fishery}}$ at threshold |             | $v_{\text{survey}}$ at threshold |           |
|------|--------|---------------|--|-------------|--------------|-----------------------------------|-------------|----------------------------------|-----------|
|      |        |               | sens-spec                              | pred. value | Fishery Area | sens-spec                         | pred. value | sens-spec                        | pred. val |
| 2013 | spring | prediction+SE | 56037                                  | 16487       |              |                                   | 0.635       | 0.360                            |           |
| 2014 | spring | prediction    | 52748                                  | 15641       |              |                                   | 0.613       | 0.362                            |           |
| 2014 | spring | prediction-SE | 47807                                  | 13112       |              |                                   | 0.581       | 0.381                            |           |
| 2014 | spring | prediction+SE | 57484                                  | 18548       |              |                                   | 0.635       | 0.384                            |           |
| 2015 | spring | prediction    | 54853                                  | 15574       |              |                                   | 0.614       | 0.304                            |           |
| 2015 | spring | prediction-SE | 50309                                  | 13844       |              |                                   | 0.586       | 0.303                            |           |
| 2015 | spring | prediction+SE | 58931                                  | 19080       |              |                                   | 0.633       | 0.324                            |           |
| 2016 | spring | prediction    | 57878                                  | 16107       |              |                                   | 0.616       | 0.240                            |           |
| 2016 | spring | prediction-SE | 52288                                  | 13061       |              |                                   | 0.588       | 0.220                            |           |
| 2016 | spring | prediction+SE | 69614                                  | 20983       |              |                                   | 0.583       | 0.273                            |           |
| 2017 | spring | prediction    | 112045                                 | 17561       |              |                                   | 0.373       | 0.220                            |           |
| 2017 | spring | prediction-SE | 92158                                  | 13543       |              |                                   | 0.391       | 0.212                            |           |
| 2017 | spring | prediction+SE | 132204                                 | 22682       |              |                                   | 0.357       | 0.287                            |           |
| 2018 | spring | prediction    | 238499                                 | 28216       |              |                                   | 0.220       | 0.212                            |           |
| 2018 | spring | prediction-SE | 188827                                 | 18072       |              |                                   | 0.244       | 0.225                            |           |
| 2018 | spring | prediction+SE | 269220                                 | 42987       |              |                                   | 0.213       | 0.213                            |           |
| 2019 | spring | prediction    | 299191                                 | 103145      |              |                                   | 0.206       | 0.110                            |           |
| 2019 | spring | prediction-SE | 273357                                 | 72126       |              |                                   | 0.195       | 0.104                            |           |
| 2019 | spring | prediction+SE | 318845                                 | 140356      |              |                                   | 0.220       | 0.118                            |           |

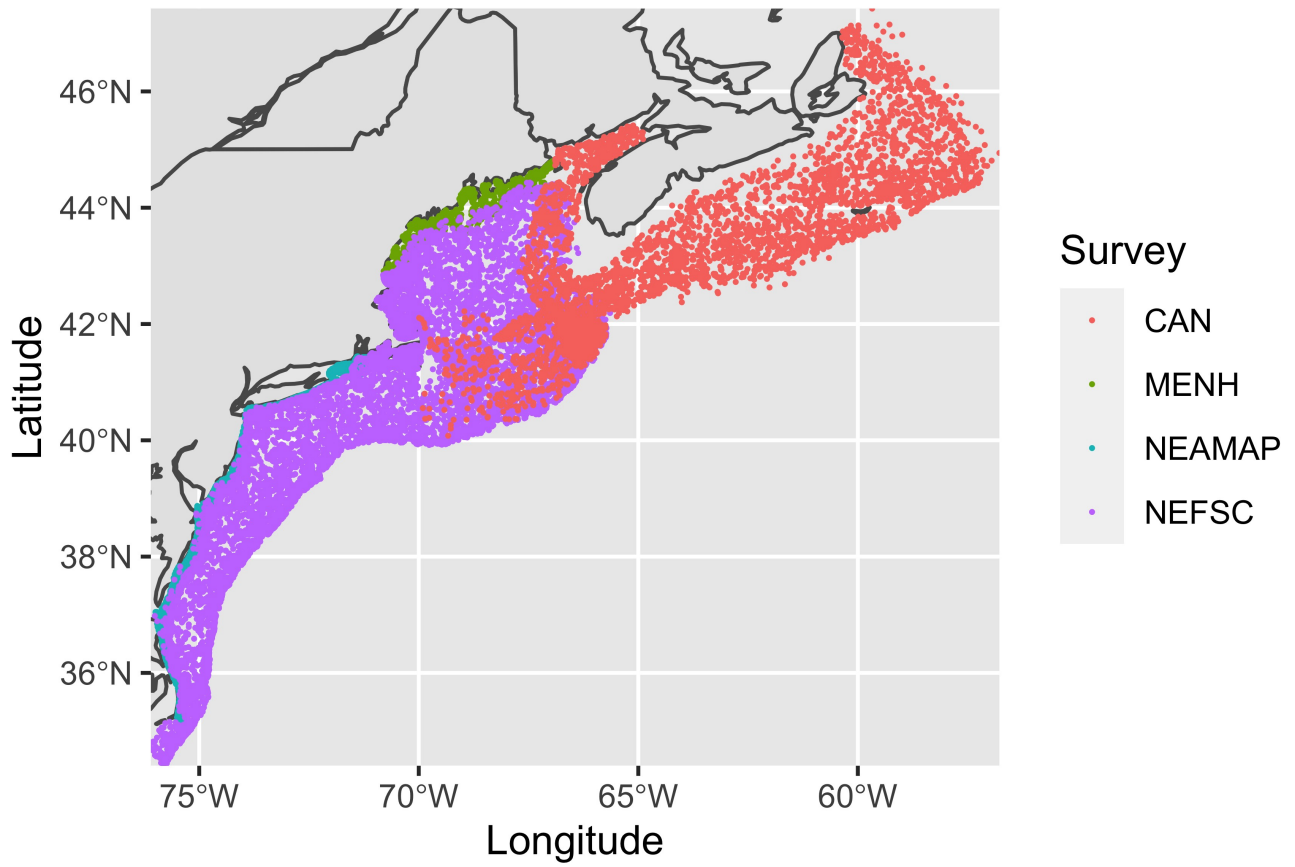


Figure 1. Map of stations sampled in the surveys of the continental shelf used to train and test the binomial GAM used to project *Illlex* species distributions

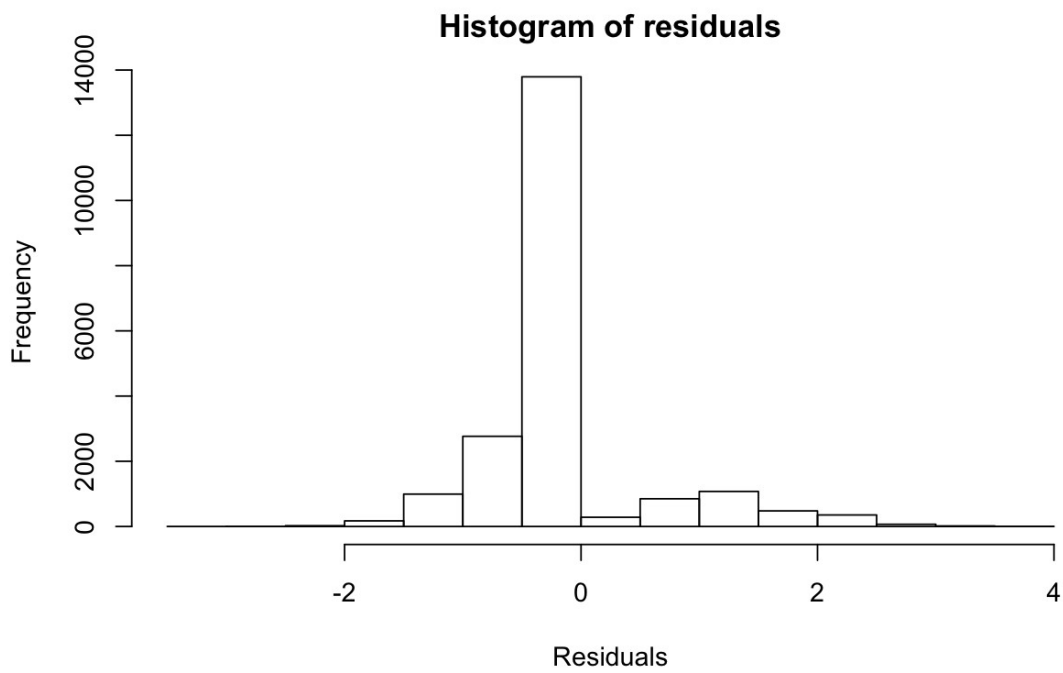
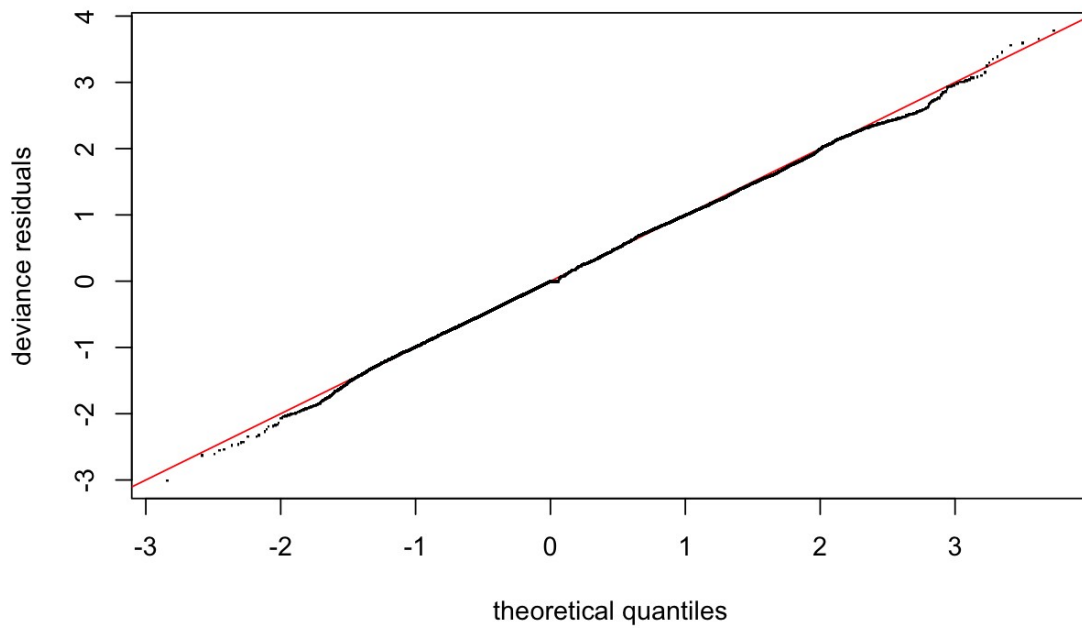


Figure 2. Distribution of residuals of the final binomial GAMM model. See table 1.



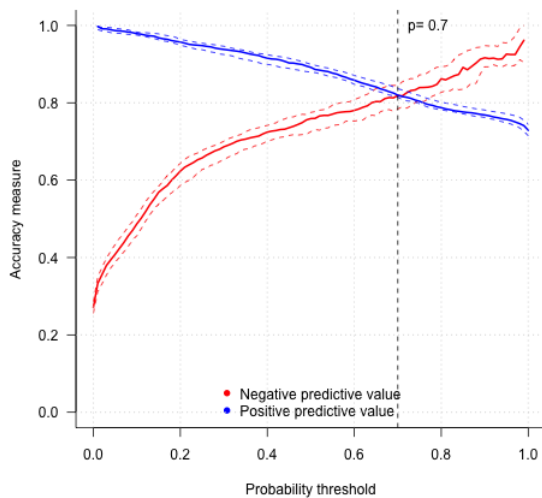
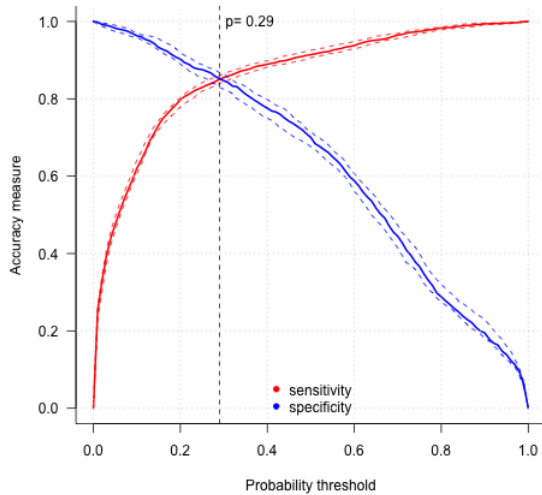
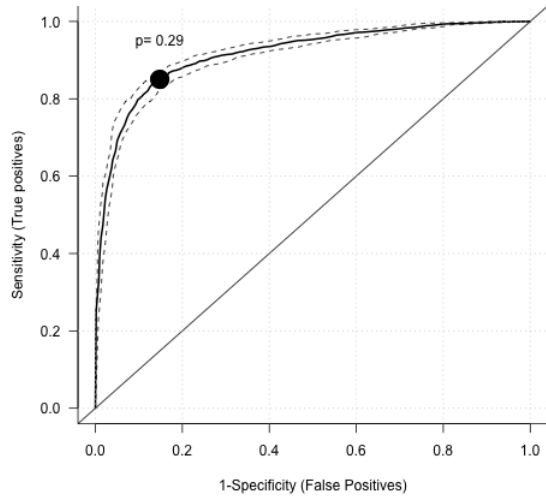


Figure 3. Top) Receiver Operator Characteristic (ROC) curves derived from 10 cross validated tests of the model. The point in the panel indicates the location on the ROC curve where sensitivity and specificity values were minimized. The diagonal line indicates the region where true and false positives are equally likely by chance. Middle) Sensitivity (the true positive predictions i.e. presences) and specificity (the true negative predictions i.e. absences) as a function of probability threshold for predicted presence from 10-fold cross validation of the GAMM species distribution model. The vertical line indicates the probability threshold where the difference between sensitivity and specificity was minimized (0.29). Bottom) Negative predictive value (proportion of negative predictions that are actually negative) and positive predictive value (proportion of positive predictions that are actually positive) were minimized at a probability threshold of 0.7. Dotted lines are 95% confidence limits developed from the 10 fold cross validation. The sensitivity-specificity and predictive value thresholds were used to classify projections of the species distributions (see Figure 4)

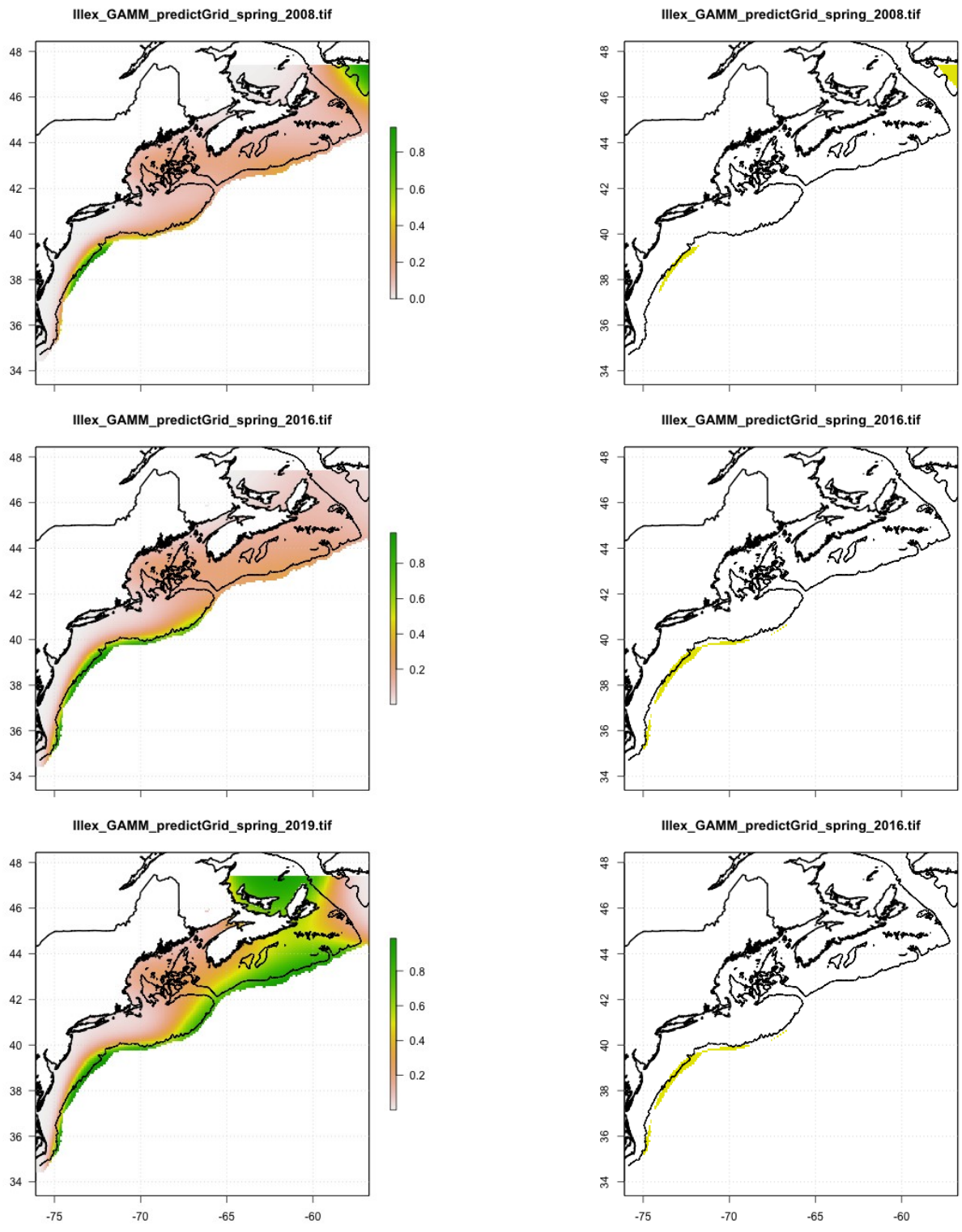


Figure 4a. Left) Projections of probability of occupancy for *Illex* from the GAMMSDM during the spring of 2008 (top), 2016 (middle), and 2019 (Bottom). Right) Species distribution maps (yellow) developed by classifying probabilities of occupancy depicted in the left panels using the predictive value threshold (0.7).

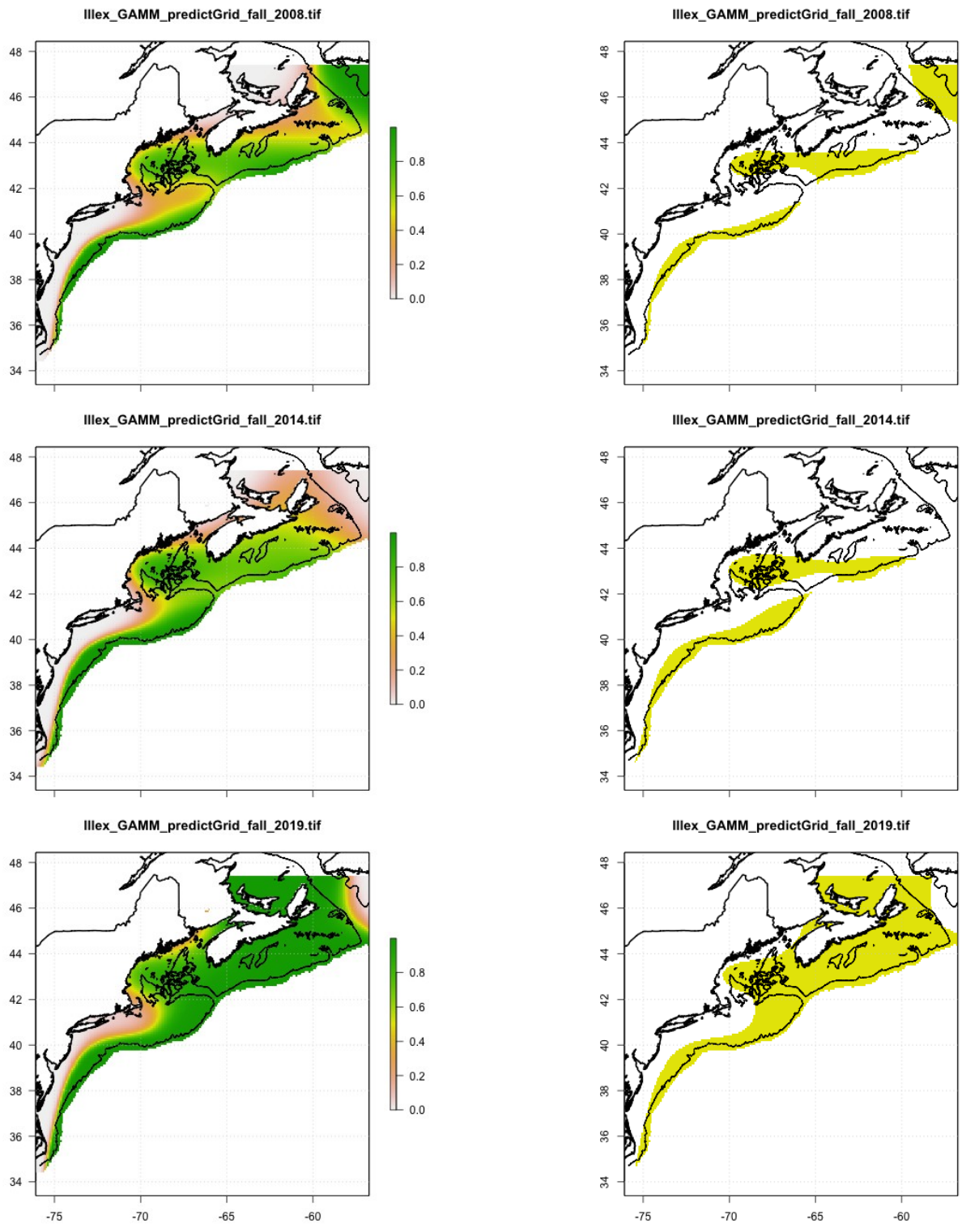


Figure 4b. Left) Projections of probability of occupancy for *Illex* from the GAMM during the fall of 2008 (top), 2014 (middle), and 2019 (Bottom). Right) Species distribution maps (yellow) developed by classifying probabilities of occupancy depicted in the left panels using the predictive value threshold (0.7).

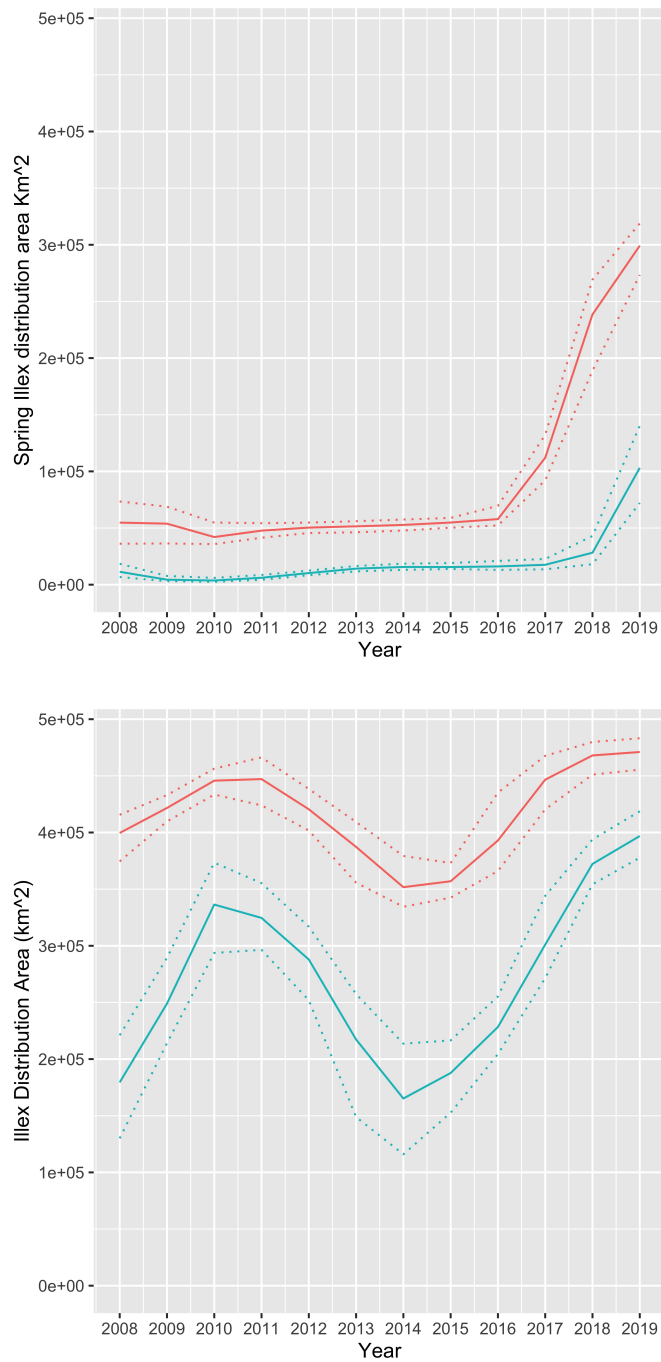


Figure 5. Species distribution areas (SDA) computed from projections of the species distribution model for *Illex* on the analysis grid classified on the basis of the sensitivity-specificity threshold (red) and the positive and negative predictive value threshold (blue). Top) SDA during the spring. Bottom) SDA in the fall. Dotted lines are areas calculated from predicted probabilities of occupancy  $\pm 1SE$ . SDAs including those associated with standard errors were used in the denominator in calculations of availability to the fishery ( $v_f$ ) and the survey ( $v_s$ ) in Table 2

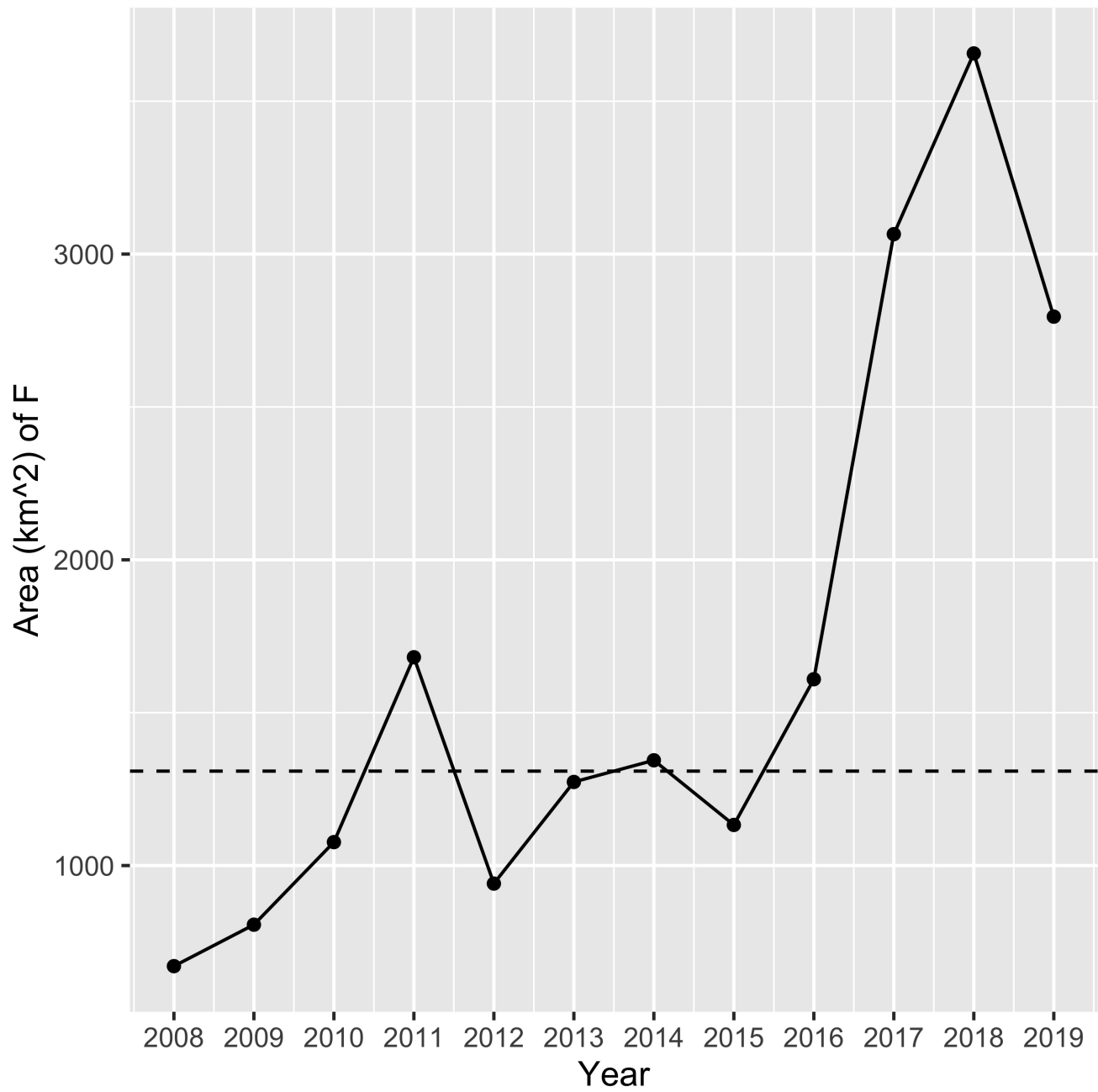


Figure 6. Fishing area calculated from gridded Vessel Trip Reports of both directed fishing and incidental catches of *Illex* in US waters.

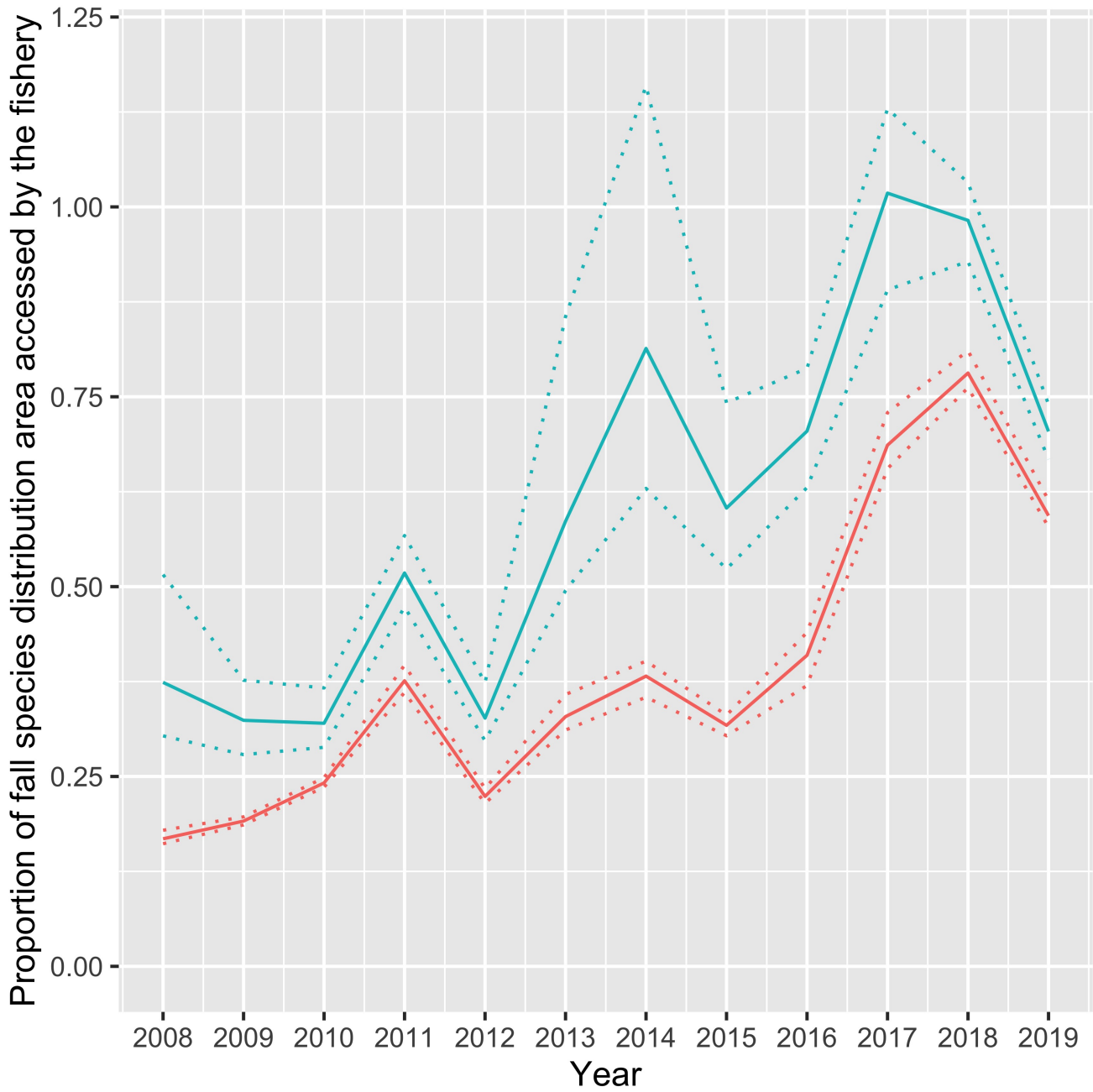


Figure 7. Availability of *Illex* to the fishery ( $v_i$ ) calculated from the overlap of the fishing area and projected species distribution during the fall of each year. Availability is the ratio of the overlapped fishing area and the species distribution area classified on the basis of the sensitivity-specificity threshold (red) and the predictive value threshold (blue). Dotted lines depict areas calculated using predictions  $\pm 1SE$

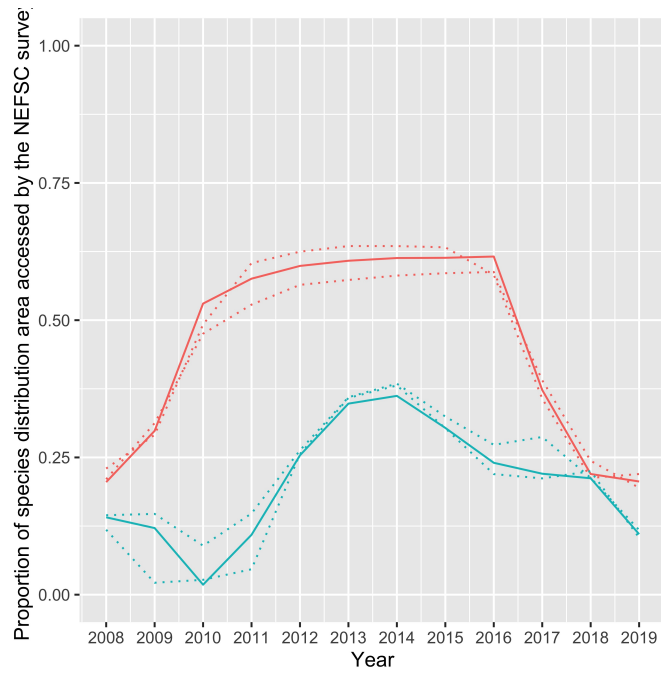


Figure 8. Availability of *Illex* to the NEFSC survey ( $v_s$ ) calculated using overlap area of survey strata used to calculate Indices of *Illex* abundance and projected species distribution during the spring (top) and fall (bottom) of each year. Availability is the ratio of the area of overlap of the survey and species distribution divided by the species distribution area classified on the basis of the sensitivity-specificity threshold (red) and the predictive value threshold (blue). Dotted lines depict areas calculated using predictions  $\pm 1$  SE.