# Density Model for Blue Whale (Balaenoptera musculus) for the U.S. East Coast: Supplementary Report 

Duke University Marine Geospatial Ecology Lab*

Model Version 1.3-2015-09-26

## Citation

When referencing our methodology or results generally, please cite our open-access article:
Roberts JJ, Best BD, Mannocci L, Fujioka E, Halpin PN, Palka DL, Garrison LP, Mullin KD, Cole TVN, Khan CB, McLellan WM, Pabst DA, Lockhart GG (2016) Habitat-based cetacean density models for the U.S. Atlantic and Gulf of Mexico. Scientific Reports 6: 22615. doi: 10.1038/srep22615

To reference this specific model or Supplementary Report, please cite:
Roberts JJ, Best BD, Mannocci L, Fujioka E, Halpin PN, Palka DL, Garrison LP, Mullin KD, Cole TVN, Khan CB, McLellan WM, Pabst DA, Lockhart GG (2015) Density Model for Blue Whale (Balaenoptera musculus) for the U.S. East Coast Version 1.3, 2015-09-26, and Supplementary Report. Marine Geospatial Ecology Lab, Duke University, Durham, North Carolina.

## Copyright and License



This document and the accompanying results are © 2015 by the Duke University Marine Geospatial Ecology Laboratory and are licensed under a Creative Commons Attribution 4.0 International License.

## Revision History

| Version | Date | Description of changes |
| :--- | :--- | :--- |
| 1 | $2015-01-06$ | Initial version. |
| 1.1 | $2015-03-06$ | Updated the documentation. No changes to the model. |
| 1.2 | $2015-05-14$ | Updated calculation of CVs. Switched density rasters to logarithmic breaks. No changes <br> to the model. |
| 1.3 | $2015-09-26$ | Updated the documentation. No changes to the model. |

[^0]| Survey | Period | Length (1000 km) | Hours | Sightings |
| :---: | :---: | :---: | :---: | :---: |
| NEFSC Aerial Surveys | 1995-2008 | 70 | 412 | 1 |
| NEFSC NARWSS Harbor Porpoise Survey | 1999-1999 | 6 | 36 | 0 |
| NEFSC North Atlantic Right Whale Sighting Survey | 1999-2013 | 432 | 2330 | 7 |
| NEFSC Shipboard Surveys | 1995-2004 | 16 | 1143 | 0 |
| NJDEP Aerial Surveys | 2008-2009 | 11 | 60 | 0 |
| NJDEP Shipboard Surveys | 2008-2009 | 14 | 836 | 0 |
| SEFSC Atlantic Shipboard Surveys | 1992-2005 | 28 | 1731 | 0 |
| SEFSC Mid Atlantic Tursiops Aerial Surveys | 1995-2005 | 35 | 196 | 0 |
| SEFSC Southeast Cetacean Aerial Surveys | 1992-1995 | 8 | 42 | 0 |
| UNCW Cape Hatteras Navy Surveys | 2011-2013 | 19 | 125 | 0 |
| UNCW Early Marine Mammal Surveys | 2002-2002 | 18 | 98 | 0 |
| UNCW Jacksonville Navy Surveys | 2009-2013 | 66 | 402 | 0 |
| UNCW Onslow Navy Surveys | 2007-2011 | 49 | 282 | 0 |
| UNCW Right Whale Surveys | 2005-2008 | 114 | 586 | 0 |
| Virginia Aquarium Aerial Surveys | 2012-2014 | 9 | 53 | 0 |
| Total |  | 895 | 8332 | 8 |

Table 2: Survey effort and sightings used in this model. Effort is tallied as the cumulative length of on-effort transects and hours the survey team was on effort. Sightings are the number of on-effort encounters of the modeled species for which a perpendicular sighting distance (PSD) was available. Off effort sightings and those without PSDs were omitted from the analysis.

| Season | Months | Length (1000 km) | Hours | Sightings |
| :--- | :--- | ---: | ---: | ---: |
| All_Year | All | 897 | 8332 | 8 |

Table 3: Survey effort and on-effort sightings having perpendicular sighting distances.


Figure 1: Blue whale sightings and survey tracklines.


Figure 2: Aerial linear survey effort per unit area.


Figure 3: Blue whale sightings per unit aerial linear survey effort.


Figure 4: Shipboard linear survey effort per unit area.


Figure 5: Blue whale sightings per unit shipboard linear survey effort.


Figure 6: Effective survey effort per unit area, for all surveys combined. Here, effort is corrected by the species- and survey-program-specific detection functions used in fitting the density models.


Figure 7: Blue whale sightings per unit of effective survey effort, for all surveys combined. Here, effort is corrected by the species- and survey-program-specific detection functions used in fitting the density models.

## Detection Functions

The detection hierarchy figures below show how sightings from multiple surveys were pooled to try to achieve Buckland et. al's (2001) recommendation that at least 60-80 sightings be used to fit a detection function. Leaf nodes, on the right, usually represent individual surveys, while the hierarchy to the left shows how they have been grouped according to how similar we believed the surveys were to each other in their detection performance.

At each node, the red or green number indicates the total number of sightings below that node in the hierarchy, and is colored green if 70 or more sightings were available, and red otherwise. If a grouping node has zero sightings-i.e. all of the surveys within it had zero sightings-it may be collapsed and shown as a leaf to save space.

Each histogram in the figure indicates a node where a detection function was fitted. The actual detection functions do not appear in this figure; they are presented in subsequent sections. The histogram shows the frequency of sightings by perpendicular sighting distance for all surveys contained by that node. Each survey (leaf node) recieves the detection function that is closest to it up the hierarchy. Thus, for common species, sufficient sightings may be available to fit detection functions deep in the hierarchy, with each function applying to only a few surveys, thereby allowing variability in detection performance between surveys to be addressed relatively finely. For rare species, so few sightings may be available that we have to pool many surveys together to try to meet Buckland's recommendation, and fit only a few coarse detection functions high in the hierarchy.

A blue Proxy Species tag indicates that so few sightings were available that, rather than ascend higher in the hierarchy to a point that we would pool grossly-incompatible surveys together, (e.g. shipboard surveys that used big-eye binoculars with those that used only naked eyes) we pooled sightings of similar species together instead. The list of species pooled is given in following sections.

## Shipboard Surveys



Figure 8: Detection hierarchy for shipboard surveys

## Binocular Surveys

Because this taxon was sighted too infrequently to fit a detection function to its sightings alone, we fit a detection function to the pooled sightings of several other species that we believed would exhibit similar detectability. These "proxy species" are listed below.

| Reported By Observer | Common Name | n |
| :--- | :--- | ---: |
| Balaenoptera | Balaenopterid sp. | 8 |
| Balaenoptera acutorostrata | Minke whale | 4 |
| Balaenoptera borealis | Sei whale | 4 |
| Balaenoptera borealis/edeni | Sei or Bryde's whale | 6 |
| Balaenoptera borealis/physalus | Fin or Sei whale | 0 |
| Balaenoptera edeni | Bryde's whale | 21 |
| Balaenoptera musculus | Blue whale | 0 |
| Balaenoptera physalus | Fin whale | 98 |
| Eubalaena glacialis | North Atlantic right whale | 4 |
| Eubalaena glacialis/Megaptera novaeangliae | Right or humpback whale | 0 |
| Megaptera novaeangliae | Humpback whale | 46 |
| Total |  | 191 |

Table 4: Proxy species used to fit detection functions for Binocular Surveys. The number of sightings, $n$, is before truncation.

The sightings were right truncated at 5500 m .

| Covariate | Description |
| :--- | :--- |
| beaufort | Beaufort sea state. |
| size | Estimated size (number of individuals) of the sighted group. <br> vesselVessel from which the observation was made. This covariate allows the detection <br> function to account for vessel-specific biases, such as the height of the survey <br> platform. |

Table 5: Covariates tested in candidate "multi-covariate distance sampling" (MCDS) detection functions.

| Key | Adjustment | Order | Covariates | Succeeded | $\Delta$ AIC | Mean ESHW (m) |
| :--- | :---: | :---: | :--- | :---: | :---: | :---: |
| hr | poly | 2 |  | Yes | 0.00 | 1309 |
| hr | poly | 4 |  | Yes | 0.47 | 1354 |
| hr |  |  | size | Yes | 0.78 | 1757 |
| hr |  |  |  | Yes | 0.80 | 1542 |
| hn | cos | 2 |  | Yes | 1.99 | 1802 |
| hr |  |  | beaufort, size | Yes | 2.64 | 1780 |
| hr |  |  | beaufort | Yes | 2.71 | 1553 |
| hr |  |  | vessel, size | Yes | 6.31 | 1920 |
| hr |  |  | vessel | Yes | 6.89 | 1605 |
| hr |  |  |  | Yes | 8.03 | 1952 |


| hr |  | beaufort, vessel | Yes | 8.50 | 1675 |
| :--- | :--- | :--- | :--- | :--- | :--- |
| hn | cos | 3 |  | Yes | 9.91 |
| hn |  | size | Yes | 11.86 | 1787 |
| hn |  | beaufort, size | Yes | 13.68 | 2317 |
| hn |  | vessel, size | Yes | 15.29 | 2319 |
| hn |  | vessel | Yes | 17.57 | 2299 |
| hn |  |  | Yes | 17.60 | 2301 |
| hn |  |  |  | Yes | 19.19 |
| hn | herm | 4 |  | No |  |
| hn |  |  | beaufort, vessel | No |  |
| hn |  |  | beaufort, vessel, size | No |  |

Table 6: Candidate detection functions for Binocular Surveys. The first one listed was selected for the density model.


Figure 9: Detection function for Binocular Surveys that was selected for the density model

Statistical output for this detection function:

```
Summary for ds object
Number of observations : 185
Distance range : 0 - 5500
AIC : 3029.944
Detection function:
    Hazard-rate key function with simple polynomial adjustment term of order 2
```

Detection function parameters
Scale Coefficients:

|  | estimater | se |
| :--- | ---: | ---: |
| (Intercept) | 6.29521 | 0.405821 |

Shape parameters:
estimate se
(Intercept) $1.061317 \mathrm{e}-070.2305982$
Adjustment term parameter(s):
estimate se
poly, order $2-0.8163340 .2362928$

Monotonicity constraints were enforced.

|  | Estimate | SE | CV |
| :--- | ---: | ---: | ---: |
| Average p | 0.238058 | 0.04195362 | 0.1762328 |
| $N$ in covered region | 777.121684 | 145.75247927 | 0.1875543 |

Monotonicity constraints were enforced.

Additional diagnostic plots:
beaufort vs. Distance, without right trunc.
beaufort vs. Distance, right trunc. at 5500 m


Figure 10: Scatterplots showing the relationship between Beaufort sea state and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). The line is a simple linear regression.

Group Size Frequency, without right trunc.
Group Size vs. Distance, without right trunc.



Group Size Frequency, right trunc. at 5500 m


Group Size vs. Distance, right trunc. at 5500 m


Figure 11: Histograms showing group size frequency and scatterplots showing the relationship between group size and perpendicular sighting distance, for all sightings (top row) and only those not right truncated (bottom row). In the scatterplot, the line is a simple linear regression.

## Low Platforms

Because this taxon was sighted too infrequently to fit a detection function to its sightings alone, we fit a detection function to the pooled sightings of several other species that we believed would exhibit similar detectability. These "proxy species" are listed below.

| Reported By Observer | Common Name | n |
| :--- | :--- | :--- |
| Balaenoptera | Balaenopterid sp. | 1 |
| Balaenoptera acutorostrata | Minke whale | 3 |


| Balaenoptera borealis | Sei whale | 4 |
| :--- | :--- | ---: |
| Balaenoptera borealis/edeni | Sei or Bryde's whale | 5 |
| Balaenoptera borealis/physalus | Fin or Sei whale | 0 |
| Balaenoptera edeni | Bryde's whale | 7 |
| Balaenoptera musculus | Blue whale | 0 |
| Balaenoptera physalus | Fin whale | 86 |
| Eubalaena glacialis | North Atlantic right whale | 3 |
| Eubalaena glacialis/Megaptera novaeangliae | Right or humpback whale | 0 |
| Megaptera novaeangliae | Humpback whale | 23 |
| Total |  | 132 |

Table 7: Proxy species used to fit detection functions for Low Platforms. The number of sightings, n, is before truncation.

The sightings were right truncated at 5500 m .

| Covariate | Description |
| :--- | :--- |
| beaufort | Beaufort sea state. |
| size | Estimated size (number of individuals) of the sighted group. |
| vessel | Vessel from which the observation was made. This covariate allows the detection <br> function to account for vessel-specific biases, such as the height of the survey <br> platform. |

Table 8: Covariates tested in candidate "multi-covariate distance sampling" (MCDS) detection functions.

| Key | Adjustment | Order | Covariates | Succeeded | $\Delta \mathrm{AIC}$ | Mean ESHW (m) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| hr |  |  | size | Yes | 0.00 | 1851 |
| hn | $\cos$ | 2 |  | Yes | 1.87 | 1764 |
| hr |  |  |  | Yes | 1.95 | 1652 |
| hr |  |  | beaufort, size | Yes | 1.99 | 1858 |
| hr |  |  | vessel, size | Yes | 2.55 | 2107 |
| hr | poly | 4 |  | Yes | 3.84 | 1634 |
| hr | poly | 2 |  | Yes | 3.89 | 1634 |
| hr |  |  | beaufort, vessel, size | Yes | 4.48 | 2116 |
| hr |  |  | vessel | Yes | 5.62 | 1830 |
| hn |  |  | size | Yes | 6.79 | 2311 |
| hr |  |  | beaufort, vessel | Yes | 7.51 | 1860 |
| hn |  |  | vessel, size | Yes | 8.30 | 2288 |
| hn |  |  | beaufort, size | Yes | 8.64 | 2312 |
| hn | $\cos$ | 3 |  | Yes | 11.49 | 1819 |


| hn | vessel | Yes | 13.80 | 2330 |
| :--- | :--- | :--- | :--- | :--- |
| hn |  |  | Yes | 15.66 |
| hn |  | beaufort | Yes | 17.02 |
| hn | herm | 4 |  | No |
| hr |  | beaufort |  |  |
| hn |  | beaufort, vessel | No |  |
| hn |  | beaufort, vessel, size | No |  |

Table 9: Candidate detection functions for Low Platforms. The first one listed was selected for the density model.


Figure 12: Detection function for Low Platforms that was selected for the density model

Statistical output for this detection function:

```
Summary for ds object
Number of observations : 128
Distance range : 0 - 5500
AIC : 2096.769
Detection function:
    Hazard-rate key function
Detection function parameters
Scale Coefficients:
\begin{tabular}{lrr} 
& estimate & se \\
(Intercept) & 6.3348086 & 0.3715707 \\
size & 0.4890754 & 0.2062362
\end{tabular}
```

Shape parameters:

|  | estimate | se |
| :--- | ---: | ---: |
| (Intercept) | 0.6087008 | 0.1772532 |

Estimate SE CV
$\begin{array}{lrrr} & \text { Estimate } & \text { SE } & \text { CV } \\ \text { Average p } & 0.3142815 & 0.03980905 & 0.1266668 \\ \mathrm{~N} \text { in covered region } 407.2782102 & 59.82362021 & 0.1468864\end{array}$

Additional diagnostic plots:
beaufort vs. Distance, without right trunc.

beaufort vs. Distance, right trunc. at 5500 m


Figure 13: Scatterplots showing the relationship between Beaufort sea state and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). The line is a simple linear regression.

Group Size Frequency, without right trunc.


Group Size Frequency, right trunc. at 5500 m


Group Size vs. Distance, without right trunc.


Group Size vs. Distance, right trunc. at 5500 m


Figure 14: Histograms showing group size frequency and scatterplots showing the relationship between group size and perpendicular sighting distance, for all sightings (top row) and only those not right truncated (bottom row). In the scatterplot, the line is a simple linear regression.

## Naked Eye Surveys

Because this taxon was sighted too infrequently to fit a detection function to its sightings alone, we fit a detection function to the pooled sightings of several other species that we believed would exhibit similar detectability. These "proxy species" are listed below.

| Reported By Observer | Common Name | n |
| :--- | :--- | ---: |
| Balaenoptera | Balaenopterid sp. | 7 |
| Balaenoptera acutorostrata | Minke whale | 177 |


| Balaenoptera borealis | Sei whale | 68 |
| :--- | :--- | ---: |
| Balaenoptera borealis/edeni | Sei or Bryde's whale | 0 |
| Balaenoptera borealis/physalus | Fin or Sei whale | 4 |
| Balaenoptera edeni | Bryde's whale | 1 |
| Balaenoptera musculus | Blue whale | 5 |
| Balaenoptera physalus | Fin whale | 261 |
| Eubalaena glacialis | North Atlantic right whale | 10 |
| Eubalaena glacialis/Megaptera novaeangliae | Right or humpback whale | 0 |
| Megaptera novaeangliae | Humpback whale | 38 |
| Total |  | 571 |

Table 10: Proxy species used to fit detection functions for Naked Eye Surveys. The number of sightings, n, is before truncation.

The sightings were right truncated at 2500 m .

| Covariate | Description |
| :--- | :--- |
| beaufort | Beaufort sea state. |
| size | Estimated size (number of individuals) of the sighted group. |

Table 11: Covariates tested in candidate "multi-covariate distance sampling" (MCDS) detection functions.

| Key | Adjustment | Order | Covariates | Succeeded | $\Delta \mathrm{AIC}$ | Mean ESHW (m) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| hn | $\cos$ | 2 |  | Yes | 0.00 | 788 |
| hr |  |  | size | Yes | 0.23 | 881 |
| hr | poly | 2 |  | Yes | 4.00 | 802 |
| hr | poly | 4 |  | Yes | 4.09 | 816 |
| hr |  |  |  | Yes | 5.53 | 844 |
| hn | $\cos$ | 3 |  | Yes | 12.95 | 774 |
| hn |  |  | size | Yes | 17.09 | 953 |
| hn |  |  | beaufort, size | Yes | 19.06 | 953 |
| hn |  |  |  | Yes | 28.40 | 951 |
| hn |  |  | beaufort | Yes | 30.12 | 951 |
| hn | herm | 4 |  | No |  |  |
| hr |  |  | beaufort | No |  |  |
| hr |  |  | beaufort, size | No |  |  |

Table 12: Candidate detection functions for Naked Eye Surveys. The first one listed was selected for the density model.

Half-normal key with 2nd order cosine adjustment 543 sightings, right truncated at 2500 m


Distance


Figure 15: Detection function for Naked Eye Surveys that was selected for the density model

Statistical output for this detection function:

```
Summary for ds object
Number of observations : 543
Distance range : 0 - 2500
AIC : 7957.87
Detection function:
    Half-normal key function with cosine adjustment term of order 2
Detection function parameters
Scale Coefficients:
    estimate se
(Intercept) 6.752179 0.03907979
Adjustment term parameter(s):
    estimate se
cos, order 2 0.4104348 0.07032499
Monotonicity constraints were enforced.
\begin{tabular}{lrrr} 
& Estimate & SE & CV \\
Average p & 0.3152004 & 0.01193711 & 0.03787151 \\
\(N\) in covered region 1722.7138013 & 89.43842935 & 0.05191717 \\
\\
& \\
Monotonicity constraints were enforced.
\end{tabular}
```

Additional diagnostic plots:
beaufort vs. Distance, without right trunc.


Figure 16: Scatterplots showing the relationship between Beaufort sea state and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). The line is a simple linear regression.

Group Size Frequency, without right trunc.


Group Size Frequency, right trunc. at $\mathbf{2 5 0 0} \mathbf{m}$


Group Size vs. Distance, without right trunc.


Group Size vs. Distance, right trunc. at 2500 m


Figure 17: Histograms showing group size frequency and scatterplots showing the relationship between group size and perpendicular sighting distance, for all sightings (top row) and only those not right truncated (bottom row). In the scatterplot, the line is a simple linear regression.

## NEFSC Abel-J Naked Eye Surveys

Because this taxon was sighted too infrequently to fit a detection function to its sightings alone, we fit a detection function to the pooled sightings of several other species that we believed would exhibit similar detectability. These "proxy species" are listed below.

| Reported By Observer | Common Name | n |
| :--- | :--- | ---: |
| Balaenoptera | Balaenopterid sp. | 0 |
| Balaenoptera acutorostrata | Minke whale | 100 |


| Balaenoptera borealis | Sei whale | 2 |
| :--- | :--- | ---: |
| Balaenoptera borealis/edeni | Sei or Bryde's whale | 0 |
| Balaenoptera borealis/physalus | Fin or Sei whale | 0 |
| Balaenoptera edeni | Bryde's whale | 0 |
| Balaenoptera musculus | Blue whale | 0 |
| Balaenoptera physalus | Fin whale | 57 |
| Eubalaena glacialis | North Atlantic right whale | 10 |
| Eubalaena glacialis/Megaptera novaeangliae | Right or humpback whale | 0 |
| Megaptera novaeangliae | Humpback whale | 37 |
| Total |  | 206 |

Table 13: Proxy species used to fit detection functions for NEFSC Abel-J Naked Eye Surveys. The number of sightings, $n$, is before truncation.

The sightings were right truncated at 2500 m .

| Covariate | Description |
| :--- | :--- |
| beaufort | Beaufort sea state. |
| quality | Survey-specific index of the quality of observation conditions, utilizing relevant <br> factors other than Beaufort sea state (see methods). |
| size | Estimated size (number of individuals) of the sighted group. |

Table 14: Covariates tested in candidate "multi-covariate distance sampling" (MCDS) detection functions.

| Key | Adjustment | Order | Covariates | Succeeded | $\Delta \mathrm{AIC}$ | Mean ESHW (m) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| hn | $\cos$ | 2 |  | Yes | 0.00 | 714 |
| hr |  |  | size | Yes | 0.04 | 799 |
| hr |  |  |  | Yes | 0.63 | 760 |
| hr | poly | 4 |  | Yes | 0.75 | 741 |
| hr | poly | 2 |  | Yes | 1.11 | 728 |
| hn | cos | 3 |  | Yes | 2.84 | 669 |
| hn |  |  | size | Yes | 5.20 | 855 |
| hn |  |  | quality, size | Yes | 6.85 | 854 |
| hn |  |  |  | Yes | 10.43 | 845 |
| hn |  |  | quality | Yes | 12.24 | 845 |
| hn | herm | 4 |  | No |  |  |
| hn |  |  | beaufort | No |  |  |
| hr |  |  | beaufort | No |  |  |
| hr |  |  | quality | No |  |  |
| hn |  |  | beaufort, quality | No |  |  |


| hr | beaufort, quality | No |
| :--- | :--- | :--- |
| hn | beaufort, size | No |
| hr | beaufort, size | No |
| hr | quality, size | No |
| hn | beaufort, quality, size | No |
| hr | beaufort, quality, size | No |

Table 15: Candidate detection functions for NEFSC Abel-J Naked Eye Surveys. The first one listed was selected for the density model.


Figure 18: Detection function for NEFSC Abel-J Naked Eye Surveys that was selected for the density model

Statistical output for this detection function:

```
Summary for ds object
Number of observations : 204
Distance range : 0 - 2500
AIC : 2944.665
Detection function:
    Half-normal key function with cosine adjustment term of order 2
Detection function parameters
Scale Coefficients:
    estimate se
(Intercept) 6.665111 0.06962659
Adjustment term parameter(s):
```

```
    estimate se
cos, order 2 0.4654075 0.1236342
```

Monotonicity constraints were enforced.

|  | Estimate | SE | CV |
| :--- | ---: | ---: | ---: |
| Average p | 0.2857526 | 0.01551915 | 0.05430974 |
| $N$ in covered region | 713.9042362 | 57.33838189 | 0.08031663 |

Monotonicity constraints were enforced.

Additional diagnostic plots:
beaufort vs. Distance, without right trunc.

beaufort vs. Distance, right trunc. at $\mathbf{2 5 0 0} \mathbf{m}$


Figure 19: Scatterplots showing the relationship between Beaufort sea state and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). The line is a simple linear regression.
quality vs. Distance, without right trunc.

quality vs. Distance, right trunc. at $\mathbf{2 5 0 0} \mathbf{~ m}$


Figure 20: Scatterplots showing the relationship between the survey-specific index of the quality of observation conditions and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). Low values of the quality index correspond to better observation conditions. The line is a simple linear regression.


Figure 21: Histograms showing group size frequency and scatterplots showing the relationship between group size and perpendicular sighting distance, for all sightings (top row) and only those not right truncated (bottom row). In the scatterplot, the line is a simple linear regression.

## CODA and SCANS II

Because this taxon was sighted too infrequently to fit a detection function to its sightings alone, we fit a detection function to the pooled sightings of several other species that we believed would exhibit similar detectability. These "proxy species" are listed below.

| Reported By Observer | Common Name | n |
| :--- | :--- | ---: |
| Balaenoptera | Balaenopterid sp. | 0 |
| Balaenoptera acutorostrata | Minke whale | 76 |


| Balaenoptera borealis | Sei whale | 12 |
| :--- | :--- | ---: |
| Balaenoptera borealis/edeni | Sei or Bryde's whale | 0 |
| Balaenoptera borealis/physalus | Fin or Sei whale | 4 |
| Balaenoptera edeni | Bryde's whale | 0 |
| Balaenoptera musculus | Blue whale | 1 |
| Balaenoptera physalus | Fin whale | 192 |
| Eubalaena glacialis | North Atlantic right whale | 0 |
| Eubalaena glacialis/Megaptera novaeangliae | Right or humpback whale | 0 |
| Megaptera novaeangliae | Humpback whale | 0 |
| Total |  | 285 |

Table 16: Proxy species used to fit detection functions for CODA and SCANS II. The number of sightings, n, is before truncation.

The sightings were right truncated at 2500 m .

| Covariate | Description |
| :--- | :--- |
| beaufort | Beaufort sea state. |
| quality | Survey-specific index of the quality of observation conditions, utilizing relevant <br> factors other than Beaufort sea state (see methods). <br> size |

Table 17: Covariates tested in candidate "multi-covariate distance sampling" (MCDS) detection functions.

| Key | Adjustment | Order | Covariates | Succeeded | $\Delta \mathrm{AIC}$ | Mean ESHW (m) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| hn | $\cos$ | 2 |  | Yes | 0.00 | 796 |
| hn |  |  | size | Yes | 3.86 | 900 |
| hn |  |  |  | Yes | 4.25 | 901 |
| hn | cos | 3 |  | Yes | 4.27 | 815 |
| hr | poly | 2 |  | Yes | 4.81 | 836 |
| hr |  |  |  | Yes | 5.06 | 929 |
| hr | poly | 4 |  | Yes | 5.80 | 872 |
| hr |  |  | size | Yes | 7.05 | 931 |
| hn | herm | 4 |  | No |  |  |
| hn |  |  | beaufort | No |  |  |
| hr |  |  | beaufort | No |  |  |
| hn |  |  | quality | No |  |  |
| hr |  |  | quality | No |  |  |
| hn |  |  | beaufort, quality | No |  |  |
| hr |  |  | beaufort, quality | No |  |  |


| hn | beaufort, size | No |
| :--- | :--- | :--- |
| hr | beaufort, size | No |
| hn | quality, size | No |
| hr | quality, size | No |
| hn | beaufort, quality, size | No |
| hr | beaufort, quality, size | No |

Table 18: Candidate detection functions for CODA and SCANS II. The first one listed was selected for the density model.


Figure 22: Detection function for CODA and SCANS II that was selected for the density model

Statistical output for this detection function:

```
Summary for ds object
Number of observations : 265
Distance range : 0 - 2500
AIC : 3866.705
Detection function:
    Half-normal key function with cosine adjustment term of order 2
Detection function parameters
Scale Coefficients:
    estimate se
(Intercept) 6.669743 0.05443104
Adjustment term parameter(s):
```

```
    estimate se
cos, order 2 0.2900289 0.1074259
```

Monotonicity constraints were enforced.

|  | Estimate | SE | CV |
| :--- | ---: | ---: | ---: |
| Average p | 0.3182232 | 0.01860504 | 0.05846537 |
| N in covered region | 832.7488117 | 64.45573775 | 0.07740118 |

Monotonicity constraints were enforced.

Additional diagnostic plots:
beaufort vs. Distance, without right trunc.

beaufort vs. Distance, right trunc. at $\mathbf{2 5 0 0} \mathbf{~ m}$


Figure 23: Scatterplots showing the relationship between Beaufort sea state and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). The line is a simple linear regression.
quality vs. Distance, without right trunc.
quality vs. Distance, right trunc. at $\mathbf{2 5 0 0} \mathbf{m}$



Figure 24: Scatterplots showing the relationship between the survey-specific index of the quality of observation conditions and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). Low values of the quality index correspond to better observation conditions. The line is a simple linear regression.


Figure 25: Histograms showing group size frequency and scatterplots showing the relationship between group size and perpendicular sighting distance, for all sightings (top row) and only those not right truncated (bottom row). In the scatterplot, the line is a simple linear regression.

## Aerial Surveys



Figure 26: Detection hierarchy for aerial surveys

## With Belly Observers

Because this taxon was sighted too infrequently to fit a detection function to its sightings alone, we fit a detection function to the pooled sightings of several other species that we believed would exhibit similar detectability. These "proxy species" are listed below.

| Reported By Observer | Common Name | n |
| :--- | :--- | ---: |
| Balaenoptera | Balaenopterid sp. | 2 |
| Balaenoptera acutorostrata | Minke whale | 97 |
| Balaenoptera borealis | Sei whale | 14 |
| Balaenoptera borealis/edeni | Sei or Bryde's whale | 0 |
| Balaenoptera borealis/physalus | Fin or Sei whale | 0 |


| Balaenoptera edeni | Bryde's whale | 2 |
| :--- | :--- | ---: |
| Balaenoptera musculus | Blue whale | 1 |
| Balaenoptera physalus | Fin whale | 235 |
| Eubalaena glacialis | North Atlantic right whale | 43 |
| Eubalaena glacialis/Megaptera novaeangliae | Right or humpback whale | 0 |
| Megaptera novaeangliae | Humpback whale | 198 |
| Total |  | 592 |

Table 19: Proxy species used to fit detection functions for With Belly Observers. The number of sightings, n, is before truncation.

The sightings were right truncated at 2000 m .

| Covariate | Description |
| :--- | :--- |
| beaufort | Beaufort sea state. |
| size | Estimated size (number of individuals) of the sighted group. |

Table 20: Covariates tested in candidate "multi-covariate distance sampling" (MCDS) detection functions.

| Key | Adjustment | Order | Covariates | Succeeded | $\Delta \mathrm{AIC}$ | Mean ESHW (m) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| hn | cos | 2 |  | Yes | 0.00 | 594 |
| hr | poly | 2 |  | Yes | 1.71 | 598 |
| hr | poly | 4 |  | Yes | 1.86 | 609 |
| hr |  |  | size | Yes | 6.10 | 632 |
| hr |  |  |  | Yes | 7.37 | 627 |
| hn | $\cos$ | 3 |  | Yes | 11.15 | 585 |
| hn |  |  | size | Yes | 22.91 | 705 |
| hn |  |  |  | Yes | 23.39 | 703 |
| hn | herm | 4 |  | No |  |  |
| hn |  |  | beaufort | No |  |  |
| hr |  |  | beaufort | No |  |  |
| hn |  |  | beaufort, size | No |  |  |
| hr |  |  | beaufort, size | No |  |  |

Table 21: Candidate detection functions for With Belly Observers. The first one listed was selected for the density model.


Figure 27: Detection function for With Belly Observers that was selected for the density model

Statistical output for this detection function:

Summary for ds object
Number of observations : 495
Distance range : 0 - 2000
AIC : 6960.823

Detection function:
Half-normal key function with cosine adjustment term of order 2

Detection function parameters
Scale Coefficients:

> estimate se
(Intercept) 6.4648170 .04316341

```
Adjustment term parameter(s):
    estimate se
cos, order 2 0.4286652 0.0797525
```

Monotonicity constraints were enforced.

|  | Estimate | SE | CV |
| :--- | ---: | ---: | ---: |
| Average p | 0.2967565 | 0.01131843 | 0.03814048 |
| $N$ in covered region | 1668.0343783 | 89.44444687 | 0.05362266 |
|  |  |  |  |
| Monotonicity constraints were enforced. |  |  |  |

Additional diagnostic plots:
beaufort vs. Distance, without right trunc.



Figure 28: Scatterplots showing the relationship between Beaufort sea state and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). The line is a simple linear regression.

Group Size Frequency, without right trunc.


Group Size Frequency, right trunc. at 2000 m


Group Size vs. Distance, without right trunc.


Group Size vs. Distance, right trunc. at 2000 m


Figure 29: Histograms showing group size frequency and scatterplots showing the relationship between group size and perpendicular sighting distance, for all sightings (top row) and only those not right truncated (bottom row). In the scatterplot, the line is a simple linear regression.

## Without Belly Observers - 600 ft

Because this taxon was sighted too infrequently to fit a detection function to its sightings alone, we fit a detection function to the pooled sightings of several other species that we believed would exhibit similar detectability. These "proxy species" are listed below.

| Reported By Observer | Common Name | n |
| :--- | :--- | :---: |
| Balaenoptera | Balaenopterid sp. | 2 |
| Balaenoptera acutorostrata | Minke whale | 8 |


| Balaenoptera borealis | Sei whale | 0 |
| :--- | :--- | ---: |
| Balaenoptera borealis/edeni | Sei or Bryde's whale | 0 |
| Balaenoptera borealis/physalus | Fin or Sei whale | 0 |
| Balaenoptera edeni | Bryde's whale | 0 |
| Balaenoptera musculus | Blue whale | 0 |
| Balaenoptera physalus | Fin whale | 15 |
| Eubalaena glacialis | North Atlantic right whale | 2 |
| Eubalaena glacialis/Megaptera novaeangliae | Right or humpback whale | 0 |
| Megaptera novaeangliae | Humpback whale | 16 |
| Physeter macrocephalus | Sperm whale | 10 |
| Total |  | 53 |

Table 22: Proxy species used to fit detection functions for Without Belly Observers - 600 ft . The number of sightings, n, is before truncation.

The sightings were right truncated at 600 m . Due to a reduced frequency of sightings close to the trackline that plausibly resulted from the behavior of the observers and/or the configuration of the survey platform, the sightings were left truncted as well. Sightings closer than 32 m to the trackline were omitted from the analysis, and it was assumed that the the area closer to the trackline than this was not surveyed. This distance was estimated by inspecting histograms of perpendicular sighting distances.

| Covariate | Description |
| :--- | :--- |
| beaufort | Beaufort sea state. |
| size | Estimated size (number of individuals) of the sighted group. |

Table 23: Covariates tested in candidate "multi-covariate distance sampling" (MCDS) detection functions.

| Key | Adjustment | Order | Covariates | Succeeded | $\Delta$ AIC | Mean ESHW (m) |
| :--- | :---: | :---: | :--- | :---: | :---: | ---: |
| hn |  |  |  | Yes | 0.00 | 293 |
| hr |  |  | Yeaufort | Yes | 1.57 | 318 |
| hn |  |  |  | Yes | 1.65 | 293 |
| hn | cos | 3 |  | Yes | 1.93 | 311 |
| hn | herm | 4 |  | Yes | 1.97 | 291 |
| hr |  |  | beaufort | Yes | 1.97 | 326 |
| hn | cos | 2 |  | Yes | 3.14 | 283 |
| hr | poly | 2 |  | Yes | 3.14 | 318 |
| hr | poly | 4 |  | No |  | 318 |
| hn |  |  | size | No |  |  |
| hr |  |  | size | beaufort, size | No |  |
| hn |  |  | beaufort, size | No |  |  |
| hr |  |  |  |  |  |  |

Table 24: Candidate detection functions for Without Belly Observers - 600 ft . The first one listed was selected for the density model.


Figure 30: Detection function for Without Belly Observers - 600 ft that was selected for the density model

Statistical output for this detection function:

```
Summary for ds object
Number of observations : 46
Distance range : 32.24668 - 600
AIC : 177.4011
Detection function:
    Half-normal key function
Detection function parameters
Scale Coefficients:
    estimate se
(Intercept) 5.581559 0.1339955
\begin{tabular}{lrrr} 
& Estimate & SE & CV \\
Average p & 0.487738 & 0.06208134 & 0.1272842 \\
\(N\) in covered region & 94.312922 & 15.59372100 & 0.1653402
\end{tabular}
```

Additional diagnostic plots:

## Left trucated sightings (in black)



Figure 31: Density of sightings by perpendicular distance for Without Belly Observers - 600 ft . Black bars on the left show sightings that were left truncated.
beaufort vs. Distance, without right trunc.



Figure 32: Scatterplots showing the relationship between Beaufort sea state and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). The line is a simple linear regression.

Group Size Frequency, without right trunc.


Group Size Frequency, right trunc. at $\mathbf{6 0 0} \mathrm{m}$


Group Size vs. Distance, without right trunc.


Group Size vs. Distance, right trunc. at $\mathbf{6 0 0} \mathbf{~ m}$


Figure 33: Histograms showing group size frequency and scatterplots showing the relationship between group size and perpendicular sighting distance, for all sightings (top row) and only those not right truncated (bottom row). In the scatterplot, the line is a simple linear regression.

## Without Belly Observers - 750 ft

Because this taxon was sighted too infrequently to fit a detection function to its sightings alone, we fit a detection function to the pooled sightings of several other species that we believed would exhibit similar detectability. These "proxy species" are listed below.

| Reported By Observer | Common Name | n |
| :--- | :--- | :--- |
| Balaenoptera | Balaenopterid sp. | 1 |
| Balaenoptera acutorostrata | Minke whale | 0 |


| Balaenoptera borealis | Sei whale | 0 |
| :--- | :--- | ---: |
| Balaenoptera borealis/edeni | Sei or Bryde's whale | 2 |
| Balaenoptera borealis/physalus | Fin or Sei whale | 0 |
| Balaenoptera edeni | Bryde's whale | 3 |
| Balaenoptera musculus | Blue whale | 0 |
| Balaenoptera physalus | Fin whale | 2 |
| Eubalaena glacialis | North Atlantic right whale | 0 |
| Eubalaena glacialis/Megaptera novaeangliae | Right or humpback whale | 0 |
| Megaptera novaeangliae | Humpback whale | 6 |
| Physeter macrocephalus | Sperm whale | 37 |
| Total |  | 51 |

Table 25: Proxy species used to fit detection functions for Without Belly Observers - 750 ft . The number of sightings, n, is before truncation.

The sightings were right truncated at 600 m . Due to a reduced frequency of sightings close to the trackline that plausibly resulted from the behavior of the observers and/or the configuration of the survey platform, the sightings were left truncted as well. Sightings closer than 40 m to the trackline were omitted from the analysis, and it was assumed that the the area closer to the trackline than this was not surveyed. This distance was estimated by inspecting histograms of perpendicular sighting distances. The vertical sighting angles were heaped at 10 degree increments, so the candidate detection functions were fitted using linear bins scaled accordingly.

| Key | Adjustment | Order | Covariates | Succeeded | $\Delta$ AIC | Mean ESHW (m) |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: |
| hn | cos | 2 |  | Yes | 0.00 | 216 |
| hr |  |  | Yes | 0.59 | 251 |  |
| hn | cos | 3 | Yes | 2.31 | 255 |  |
| hn | herm | 4 | Yes | 2.46 | 316 |  |
| hr | poly | 2 | Yes | 2.59 | 251 |  |
| hr | poly | 4 | Yes | 2.59 | 253 |  |
| hn |  |  | No |  |  |  |

Table 26: Candidate detection functions for Without Belly Observers - 750 ft . The first one listed was selected for the density model.

Blue whale and proxy species


Figure 34: Detection function for Without Belly Observers - 750 ft that was selected for the density model

Statistical output for this detection function:

```
Summary for ds object
Number of observations : 34
Distance range : 40.30835 - 600
AIC : 124.984
Detection function:
    Half-normal key function with cosine adjustment term of order 2
Detection function parameters
Scale Coefficients:
    estimate se
(Intercept) 5.738325 0.1838281
Adjustment term parameter(s):
    estimate se
cos, order 2 0.4333818 0.242253
```

Monotonicity constraints were enforced.

|  | Estimate | SE | CV |
| :--- | ---: | ---: | ---: |
| Average p | 0.3592782 | 0.0870934 | 0.2424122 |
| $N$ in covered region | 94.6341930 | 26.3634655 | 0.2785829 |

Monotonicity constraints were enforced.

Additional diagnostic plots:

## Left trucated sightings (in black)



Figure 35: Density of sightings by perpendicular distance for Without Belly Observers - 750 ft . Black bars on the left show sightings that were left truncated.

## Without Belly Observers - 1000 ft

Because this taxon was sighted too infrequently to fit a detection function to its sightings alone, we fit a detection function to the pooled sightings of several other species that we believed would exhibit similar detectability. These "proxy species" are listed below.

| Reported By Observer | Common Name | n |
| :--- | :--- | ---: |
| Balaenoptera | Balaenopterid sp. | 1 |
| Balaenoptera acutorostrata | Minke whale | 16 |
| Balaenoptera borealis | Sei whale | 0 |
| Balaenoptera borealis/edeni | Sei or Bryde's whale | 0 |
| Balaenoptera borealis/physalus | Fin or Sei whale | 0 |
| Balaenoptera edeni | Bryde's whale | 0 |
| Balaenoptera musculus | Blue whale | 0 |
| Balaenoptera physalus | Fin whale | 32 |
| Eubalaena glacialis | North Atlantic right whale | 34 |
| Eubalaena glacialis/Megaptera novaeangliae | Right or humpback whale | 0 |
| Megaptera novaeangliae | Humpback whale | 30 |
| Total |  | 113 |

Table 27: Proxy species used to fit detection functions for Without Belly Observers - 1000 ft . The number of sightings, $n$, is before truncation.

The sightings were right truncated at 1500 m .

| Covariate | Description |
| :--- | :--- |
| beaufort | Beaufort sea state. |
| quality | Survey-specific index of the quality of observation conditions, utilizing relevant <br> factors other than Beaufort sea state (see methods). <br> size |
| Estimated size (number of individuals) of the sighted group. |  |

Table 28: Covariates tested in candidate "multi-covariate distance sampling" (MCDS) detection functions.

| Key | Adjustment | Order | Covariates | Succeeded | $\Delta \mathrm{AIC}$ | Mean ESHW (m) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| hr |  |  |  | Yes | 0.00 | 434 |
| hr | poly | 4 |  | Yes | 1.58 | 424 |
| hn | $\cos$ | 2 |  | Yes | 1.71 | 462 |
| hr | poly | 2 |  | Yes | 1.92 | 427 |
| hr |  |  | quality | Yes | 1.96 | 433 |
| hn | $\cos$ | 3 |  | Yes | 3.64 | 418 |
| hn |  |  |  | Yes | 11.03 | 585 |
| hn | herm | 4 |  | No |  |  |
| hn |  |  | beaufort | No |  |  |
| hr |  |  | beaufort | No |  |  |
| hn |  |  | quality | No |  |  |
| hn |  |  | size | No |  |  |
| hr |  |  | size | No |  |  |
| hn |  |  | beaufort, quality | No |  |  |
| hr |  |  | beaufort, quality | No |  |  |
| hn |  |  | beaufort, size | No |  |  |
| hr |  |  | beaufort, size | No |  |  |
| hn |  |  | quality, size | No |  |  |
| hr |  |  | quality, size | No |  |  |
| hn |  |  | beaufort, quality, size | No |  |  |
| hr |  |  | beaufort, quality, size | No |  |  |

Table 29: Candidate detection functions for Without Belly Observers - 1000 ft . The first one listed was selected for the density model.


Figure 36: Detection function for Without Belly Observers - 1000 ft that was selected for the density model

Statistical output for this detection function:

```
Summary for ds object
Number of observations : 105
Distance range : 0 - 1500
AIC : 1432.491
Detection function:
    Hazard-rate key function
Detection function parameters
Scale Coefficients:
    estimate se
(Intercept) 5.576432 0.2232183
```

Shape parameters:
estimate se
(Intercept) 0.63740870 .1752092

|  | Estimate | SE | CV |
| :--- | ---: | ---: | ---: |
| Average p | 0.2891295 | 0.03984493 | 0.1378100 |
| $N$ in covered region | 363.1591175 | 58.28878285 | 0.1605048 |

Additional diagnostic plots:
beaufort vs. Distance, without right trunc.
beaufort vs. Distance, right trunc. at 1500 m


Figure 37: Scatterplots showing the relationship between Beaufort sea state and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). The line is a simple linear regression.
quality vs. Distance, without right trunc.
quality vs. Distance, right trunc. at 1500 m


Figure 38: Scatterplots showing the relationship between the survey-specific index of the quality of observation conditions and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). Low values of the quality index correspond to better observation conditions. The line is a simple linear regression.

Group Size Frequency, without right trunc.
Group Size vs. Distance, without right trunc.


Group Size Frequency, right trunc. at 1500 m



Group Size vs. Distance, right trunc. at 1500 m


Figure 39: Histograms showing group size frequency and scatterplots showing the relationship between group size and perpendicular sighting distance, for all sightings (top row) and only those not right truncated (bottom row). In the scatterplot, the line is a simple linear regression.

## UNCW Aerial Surveys

Because this taxon was sighted too infrequently to fit a detection function to its sightings alone, we fit a detection function to the pooled sightings of several other species that we believed would exhibit similar detectability. These "proxy species" are listed below.

| Reported By Observer | Common Name | n |
| :--- | :--- | ---: |
| Balaenoptera | Balaenopterid sp. | 1 |
| Balaenoptera acutorostrata | Minke whale | 15 |


| Balaenoptera borealis | Sei whale | 0 |
| :--- | :--- | ---: |
| Balaenoptera borealis/edeni | Sei or Bryde's whale | 0 |
| Balaenoptera borealis/physalus | Fin or Sei whale | 0 |
| Balaenoptera edeni | Bryde's whale | 0 |
| Balaenoptera musculus | Blue whale | 0 |
| Balaenoptera physalus | Fin whale | 19 |
| Eubalaena glacialis | North Atlantic right whale | 31 |
| Eubalaena glacialis/Megaptera novaeangliae | Right or humpback whale | 0 |
| Megaptera novaeangliae | Humpback whale | 23 |
| Total |  | 89 |

Table 30: Proxy species used to fit detection functions for UNCW Aerial Surveys. The number of sightings, n , is before truncation.

The sightings were right truncated at 1500 m .

| Covariate | Description |
| :--- | :--- |
| beaufort | Beaufort sea state. |
| quality | Survey-specific index of the quality of observation conditions, utilizing relevant <br> factors other than Beaufort sea state (see methods). |
| size | Estimated size (number of individuals) of the sighted group. |

Table 31: Covariates tested in candidate "multi-covariate distance sampling" (MCDS) detection functions.

| Key | Adjustment | Order | Covariates | Succeeded | $\Delta \mathrm{AIC}$ | Mean ESHW (m) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| hn | $\cos$ | 3 |  | Yes | 0.00 | 358 |
| hr |  |  |  | Yes | 0.01 | 397 |
| hr | poly | 4 |  | Yes | 0.85 | 391 |
| hr | poly | 2 |  | Yes | 1.03 | 386 |
| hn | cos | 2 |  | Yes | 1.24 | 409 |
| hr |  |  | quality | Yes | 1.55 | 396 |
| hn |  |  |  | Yes | 5.53 | 480 |
| hn |  |  | quality | Yes | 7.53 | 480 |
| hn | herm | 4 |  | No |  |  |
| hn |  |  | beaufort | No |  |  |
| hr |  |  | beaufort | No |  |  |
| hn |  |  | size | No |  |  |
| hr |  |  | size | No |  |  |
| hn |  |  | beaufort, quality | No |  |  |
| hr |  |  | beaufort, quality | No |  |  |


| hn | beaufort, size | No |
| :--- | :--- | :--- |
| hr | beaufort, size | No |
| hn | quality, size | No |
| hr | quality, size | No |
| hn | beaufort, quality, size | No |
| hr | beaufort, quality, size | No |

Table 32: Candidate detection functions for UNCW Aerial Surveys. The first one listed was selected for the density model.


Figure 40: Detection function for UNCW Aerial Surveys that was selected for the density model

Statistical output for this detection function:

```
Summary for ds object
Number of observations : 86
Distance range : 0 - 1500
AIC : 1144.166
Detection function:
    Half-normal key function with cosine adjustment term of order 3
Detection function parameters
Scale Coefficients:
    estimate se
(Intercept) 6.006457 0.06897785
Adjustment term parameter(s):
```

```
    estimate se
cos, order 3 0.4451316 0.1512901
```

Monotonicity constraints were enforced.

|  | Estimate | SE | CV |
| :--- | ---: | ---: | ---: |
| Average p | 0.2387636 | 0.02505434 | 0.1049337 |
| $N$ in covered region | 360.1889023 | 50.76321007 | 0.1409350 |

Monotonicity constraints were enforced.

Additional diagnostic plots:
beaufort vs. Distance, without right trunc.

beaufort vs. Distance, right trunc. at 1500 m


Figure 41: Scatterplots showing the relationship between Beaufort sea state and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). The line is a simple linear regression.
quality vs. Distance, without right trunc.

quality vs. Distance, right trunc. at 1500 m


Figure 42: Scatterplots showing the relationship between the survey-specific index of the quality of observation conditions and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). Low values of the quality index correspond to better observation conditions. The line is a simple linear regression.

Group Size Frequency, without right trunc.
Group Size vs. Distance, without right trunc.


Group Size Frequency, right trunc. at 1500 m


Group Size vs. Distance, right trunc. at 1500 m



Figure 43: Histograms showing group size frequency and scatterplots showing the relationship between group size and perpendicular sighting distance, for all sightings (top row) and only those not right truncated (bottom row). In the scatterplot, the line is a simple linear regression.

## NARWSS Grummans

Because this taxon was sighted too infrequently to fit a detection function to its sightings alone, we fit a detection function to the pooled sightings of several other species that we believed would exhibit similar detectability. These "proxy species" are listed below.

| Reported By Observer | Common Name | n |
| :--- | :--- | ---: |
| Balaenoptera | Balaenopterid sp. | 0 |
| Balaenoptera acutorostrata | Minke whale | 88 |


| Balaenoptera borealis | Sei whale | 101 |
| :--- | :--- | ---: |
| Balaenoptera borealis/edeni | Sei or Bryde's whale | 0 |
| Balaenoptera borealis/physalus | Fin or Sei whale | 0 |
| Balaenoptera edeni | Bryde's whale | 0 |
| Balaenoptera musculus | Blue whale | 0 |
| Balaenoptera physalus | Fin whale | 149 |
| Eubalaena glacialis | North Atlantic right whale | 113 |
| Eubalaena glacialis/Megaptera novaeangliae | Right or humpback whale | 0 |
| Megaptera novaeangliae | Humpback whale | 153 |
| Total |  | 604 |

Table 33: Proxy species used to fit detection functions for NARWSS Grummans. The number of sightings, n, is before truncation.

The sightings were right truncated at 3000 m . Due to a reduced frequency of sightings close to the trackline that plausibly resulted from the behavior of the observers and/or the configuration of the survey platform, the sightings were left truncted as well. Sightings closer than 107 m to the trackline were omitted from the analysis, and it was assumed that the the area closer to the trackline than this was not surveyed. This distance was estimated by inspecting histograms of perpendicular sighting distances.

| Covariate | Description |
| :--- | :--- |
| beaufort | Beaufort sea state. |
| quality | Survey-specific index of the quality of observation conditions, utilizing relevant <br> factors other than Beaufort sea state (see methods). |
| size | Estimated size (number of individuals) of the sighted group. |

Table 34: Covariates tested in candidate "multi-covariate distance sampling" (MCDS) detection functions.

| Key | Adjustment | Order | Covariates | Succeeded | $\Delta$ AIC | Mean ESHW (m) |
| :--- | :---: | :---: | :--- | :---: | :---: | ---: |
| hr |  | quality, size | Yes | 0.00 | 676 |  |
| hr |  | size | Yes | 0.23 | 664 |  |
| hr | poly | 2 |  | Yes | 1.31 | 499 |
| hr | poly | 4 |  | Yes | 1.46 | 528 |
| hr |  |  | beaufort, size | Yes | 2.18 | 663 |
| hr |  |  | quality | Yes | 5.01 | 612 |
| hr |  |  | Yeaufort | Yes | 5.18 | 7.18 |
| hr |  |  |  | Yes | 22.92 | 607 |
| hn | cos | 2 |  | Yes | 44.94 | 607 |
| hn | cos | 3 |  | Yes | 76.90 | 797 |
| hn |  |  | size | Yes | 78.25 | 730 |
| hn |  |  |  |  | 1049 |  |


| hn |  | Yes | 83.16 | 1045 |
| :--- | :--- | :--- | :--- | :--- |
| hn |  | quality | Yes | 84.79 |
| hn | herm | 4 |  | No |
| hn |  | beaufort |  |  |
| hn |  | beaufort, quality | No |  |
| hr | beaufort, quality | No |  |  |
| hn |  | beaufort, size | No |  |
| $h n$ | beaufort, quality, size | No |  |  |
| $h r$ | beaufort, quality, size | No |  |  |

Table 35: Candidate detection functions for NARWSS Grummans. The first one listed was selected for the density model.

Blue whale and proxy species


Figure 44: Detection function for NARWSS Grummans that was selected for the density model

Statistical output for this detection function:

```
Summary for ds object
Number of observations : 539
Distance range : 106.5979 - 3000
AIC : 7998.478
Detection function:
    Hazard-rate key function
Detection function parameters
Scale Coefficients:
```

|  | estimate | se |
| :--- | ---: | ---: |
| (Intercept) | 5.9530450 | 0.18080430 |
| quality | -0.1635689 | 0.09769324 |
| size | 0.1950236 | 0.06116755 |

Shape parameters:
estimate se
(Intercept) 0.57360250 .07152729
Estimate SE CV
$\begin{array}{llll}\text { Average p } \quad 0.2088055 & 0.018694930 .08953274\end{array}$
$N$ in covered region 2581.3500409251 .790757850 .09754228

Additional diagnostic plots:

## Left trucated sightings (in black)



Figure 45: Density of sightings by perpendicular distance for NARWSS Grummans. Black bars on the left show sightings that were left truncated.
beaufort vs. Distance, without right trunc.


Distance (m)


Figure 46: Scatterplots showing the relationship between Beaufort sea state and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). The line is a simple linear regression.
quality vs. Distance, without right trunc.
quality vs. Distance, right trunc. at $\mathbf{3 0 0 0} \mathbf{~ m}$


Figure 47: Scatterplots showing the relationship between the survey-specific index of the quality of observation conditions and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). Low values of the quality index correspond to better observation conditions. The line is a simple linear regression.


Figure 48: Histograms showing group size frequency and scatterplots showing the relationship between group size and perpendicular sighting distance, for all sightings (top row) and only those not right truncated (bottom row). In the scatterplot, the line is a simple linear regression.

## NARWSS Twin Otters

Because this taxon was sighted too infrequently to fit a detection function to its sightings alone, we fit a detection function to the pooled sightings of several other species that we believed would exhibit similar detectability. These "proxy species" are listed below.

| Reported By Observer | Common Name | n |
| :--- | :--- | ---: |
| Balaenoptera | Balaenopterid sp. | 0 |
| Balaenoptera acutorostrata | Minke whale | 731 |


| Balaenoptera borealis | Sei whale | 696 |
| :--- | :--- | ---: |
| Balaenoptera borealis/edeni | Sei or Bryde's whale | 0 |
| Balaenoptera borealis/physalus | Fin or Sei whale | 0 |
| Balaenoptera edeni | Bryde's whale | 0 |
| Balaenoptera musculus | Blue whale | 7 |
| Balaenoptera physalus | Fin whale | 1545 |
| Eubalaena glacialis | North Atlantic right whale | 1430 |
| Eubalaena glacialis/Megaptera novaeangliae | Right or humpback whale | 0 |
| Megaptera novaeangliae | Humpback whale | 2308 |
| Total |  | 6717 |

Table 36: Proxy species used to fit detection functions for NARWSS Twin Otters. The number of sightings, n , is before truncation.

The sightings were right truncated at 5000 m . Due to a reduced frequency of sightings close to the trackline that plausibly resulted from the behavior of the observers and/or the configuration of the survey platform, the sightings were left truncted as well. Sightings closer than 107 m to the trackline were omitted from the analysis, and it was assumed that the the area closer to the trackline than this was not surveyed. This distance was estimated by inspecting histograms of perpendicular sighting distances. The vertical sighting angles were heaped at 10 degree increments up to 80 degrees and 1 degree increments thereafter, so the candidate detection functions were fitted using linear bins scaled accordingly.

| Covariate | Description |
| :--- | :--- |
| beaufort | Beaufort sea state. |
| quality | Survey-specific index of the quality of observation conditions, utilizing relevant <br> factors other than Beaufort sea state (see methods). |
| size | Estimated size (number of individuals) of the sighted group. |

Table 37: Covariates tested in candidate "multi-covariate distance sampling" (MCDS) detection functions.

| Key | Adjustment | Order | Covariates | Succeeded | $\Delta \mathrm{AIC}$ | Mean ESHW (m) |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| hr |  |  | size | Yes | 0.00 | 1633 |
| hr | poly | 4 |  | Yes | 44.60 | 1396 |
| hr | poly | 2 |  | Yes | 56.37 | 1456 |
| hr |  |  |  | Yes | 126.36 | 1493 |
| hn | $\cos$ | 3 |  | Yes | 203.66 | 1778 |
| hn | cos | 2 |  | Yes | 213.74 | 1938 |
| hn | herm | 4 |  | Yes | 411.54 | 2331 |
| hn |  |  |  | Yes | 417.65 | 2338 |
| hn |  |  | beaufort | No |  |  |
| hr |  |  | beaufort | No |  |  |
| hn |  |  | quality | No |  |  |
| hr |  |  | quality | No |  |  |


| hn | size | No |
| :--- | :--- | :--- |
| hn | beaufort, quality | No |
| hr | beaufort, quality | No |
| hn | beaufort, size | No |
| hr | beaufort, size | No |
| hn | quality, size | No |
| hr | quality, size | No |
| hn | beaufort, quality, size | No |
| hr | beaufort, quality, size | No |

Table 38: Candidate detection functions for NARWSS Twin Otters. The first one listed was selected for the density model.


Figure 49: Detection function for NARWSS Twin Otters that was selected for the density model

Statistical output for this detection function:

```
Summary for ds object
Number of observations : 6139
Distance range : 106.5979 - 5000
AIC : 30333.52
Detection function:
    Hazard-rate key function
Detection function parameters
Scale Coefficients:
```

```
    estimate se
(Intercept) 6.0219883 0.09573340
size 0.6348279 0.06376505
Shape parameters:
    estimate se
(Intercept) 0.2576457 0.03041452
    Estimate SE CV
Average p 3.012445e-01 9.430788e-03 0.03130609
N in covered region 2.037879e+04 6.752763e+02 0.03313623
```

Additional diagnostic plots:

Left trucated sightings (in black)


Figure 50: Density of sightings by perpendicular distance for NARWSS Twin Otters. Black bars on the left show sightings that were left truncated.
beaufort vs. Distance, without right trunc.


Figure 51: Scatterplots showing the relationship between Beaufort sea state and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). The line is a simple linear regression.
quality vs. Distance, without right trunc.


Figure 52: Scatterplots showing the relationship between the survey-specific index of the quality of observation conditions and perpendicular sighting distance, for all sightings (left) and only those not right truncated (right). Low values of the quality index correspond to better observation conditions. The line is a simple linear regression.


Figure 53: Histograms showing group size frequency and scatterplots showing the relationship between group size and perpendicular sighting distance, for all sightings (top row) and only those not right truncated (bottom row). In the scatterplot, the line is a simple linear regression.

| Platform | Surveys | Group <br> Size | $g(0)$ | Biases <br> Addressed | Source |
| :--- | :--- | :--- | :--- | :--- | :--- |
| Shipboard | All | Any | 0.921 | Perception | Barlow and Forney (2007) |
| Aerial | All | Any | 0.407 | Availability | Carretta et al. (2000) |

Table 39: Estimates of $g(0)$ used in this density model.

No species- or survey-specific estimates of $g(0)$ were available for blue whales for any surveys in our study. For shipboard surveys, we used Barlow and Forney's (2007) estimate ( 0.921 ), produced from several years of dual-team surveys in the Pacific ocean that used similar binoculars and protocols to the binocular surveys in our study. This estimate accounted for perception bias but not availability bias. We also applied this estimate to the naked eye surveys in our study, as we found no estimate of $g(0)$ in the literature for blue whales observed by naked eye from shipboard surveys. In any case, the shipboard $g(0)$ estimate has little influence our density estimate for the East Coast region, as no blue whales were sighted by shipboard surveys there.

4 blue whale groups were sighted on the MAR-ECO mid-Atlantic ridge survey, and 1 group was sighted by the European CODA survey. These were naked eye surveys, but were only eligible for use in our AFTT model; please see the documentation for that model to determine if they were actually used.
For aerial surveys, we used Carretta et al.'s (2000) estimate of the availability bias component of $g(0)$ for blue whales, estimated from dive data (Barlow et al. 1997) for aerial surveys conducted with two observers with bubble windows at an altitude of $213 \mathrm{~m}(700 \mathrm{ft})$ and an airspeed of $185 \mathrm{~km} / \mathrm{hr}(100 \mathrm{kts})$. Carretta et al. did not estimate the perception bias component of $\mathrm{g}(0)$, asserting that perception bias for whales is expected to be negligible since they are rarely missed on the trackline.

## Density Model

The distribution of the blue whale in the North Atlantic generally extends from the Arctic to at least mid-latitude waters, but the actual southern limit of the species' range is unknown (Waring et al. 2011). Blue whales may migrate toward the pole to feed in summer and toward the tropics to breed in winter, but such a migration has not been well described for the North Atlantic.

The surveys used in our study reported only a few sightings. All occurred in the vicinity of the Gulf of Maine between April and November, both on continental shelf and along the shelf break. The species is relatively abundant in the in the Gulf of St. Lawrence in spring, summer, and fall (Waring et al. 2011); the Gulf Maine may represent the southern extent of the blue whale's range during feeding season.

In winter, blue whales have been detected and tracked acoustically by the U.S. Navy's SOSUS program throughout much of the North Atlantic, including in subtropical waters north of the West Indies and in deep water east of the US Atlantic EEZ (Clark 1995; Waring et al. 2011). Historical observations from whaling ships reported blue whales reported blue whales between the Bahamas and Cape Hatteras between January and March, both off and on the continental shelf (Reeves et al. 2004).

With so few sightings, we could not fit a habitat-based density model, only a stratified model. We suspect that in feeding season, blue whales are probably present only north of the Gulf Stream, where cold, nutrient-rich water promotes production of their prey. With more sightings, we could attempt a two-season model that reflects this hypothesis. But if we did that with the data currently available, our winter model would show them absent everywhere, since we had no sightings from December-March. This would somewhat contradict what is suggested by the acoustic and historic observations.

Given the few sightings available and the evidence suggesting blue whales are present both north and south of the Gulf Stream (albeit probably at different times of year) and off and on the continental shelf, the best we can do at this time is provide a mean density estimate for the entire study area.


Figure 54: Blue whale density model schematic. All sightings are shown, including those that were truncated when detection functions were fitted. The coefficient of variation (CV) underestimates the true uncertainty of our estimate, as it only incorporated the uncertainty of the GAM stage of our model. Other sources of uncertainty include the detection functions and $g(0)$ estimates. It was not possible to incorporate these into our CV without undertaking a computationally-prohibitive bootstrap; we hope to attempt that in a future version of our model.

## Abundance Estimates

| Dates | Model or study | Estimated <br> abundance | CV | Assumed <br> $\mathrm{g}(0)=1$ | In our <br> models |
| :--- | :--- | ---: | :--- | :--- | :--- |
| $1992-2014$ | Our model | 11 | 0.41 | No |  |
| $1979-2009$ | Individuals in Gulf of St. Lawrence identified by | 440 |  |  | No |
|  | photo-ID (Waring et al. 2011) |  |  |  |  |

Table 40: Estimated mean abundance within the study area for our model and independent estimates from NOAA and/or the scientific literature. The Dates column gives the dates to which the estimates apply. For our model, these are the years for survey data were available. Our coefficient of variation (CV) estimates are probably too low, as they only incorporated the uncertainty of the GAM stage of our models. Other sources of uncertainty include the detection functions and $g(0)$ estimates. It was not possible to incorporate these into our CVs without undertaking a computationally-prohibitive bootstrap; we hope to attempt that in a future version of our models. The Assumed $g(0)=1$ column specifies whether the abundance estimate assumed that detection was certain along the survey trackline. Studies that assumed this did not correct for availability or perception bias, and therefore underestimated abundance. The In our models column specifies whether the survey data from the study was also used in our models. If not, the study provides a completely independent estimate of abundance. Note that our abundance estimates are averaged over the whole year, while the other estimates apply to specific months or seasons. Please see the Discussion section below for our evaluation of our models compared to the other estimates.

## Discussion

Our model resulted in a very low total abundance estimate. The only abundance estimate we located for comparison was for the Gulf of St. Lawrence component of the Canadian stock, which was 440 whales counted by photo ID over a 30 year census period-an order of magnitude higher than our estimate. We believe our estimate is consistent with the hypothesis that the northern part of our study area represents the southernmost limit of the blue whale's summertime range.

Although we included the entire study area in our density estimate (we describe our rationale in the Density Model section above), we note that all of our sightings occurred north of 40 N and in the months of April through November. We advise ocean users who wish to minimize possible impacts on blue whales to proceed with additional caution in that region during those months.

## References

Barlow J, Forney KA (2007) Abundance and density of cetaceans in the California Current ecosystem. Fish. Bull. 105: 509-526.

Barlow J, Forney KA, Von Saunder A, Urban-Ramirez J (1997) A report of cetacean acoustic detection and dive interval studies (CADDIS) conducted in the southern Gulf of California. NOAA Technical Memorandum NOAA-TM-NMFS-SWFSC-250. 48 p.

Carretta JV, Lowry MS, Stinchcomb CE, Lynn MS, Cosgrove RE (2000) Distribution and abundance of marine mammals at San Clemente Island and surrounding offshore waters: results from aerial and ground surveys in 1998 and 1999. Administrative Report LJ-00-02, available from Southwest Fisheries Science Center, P.O. Box 271, La Jolla, CA USA 92038. 44 p.

Reeves RR, Smith TD, Josephson EA, Clapham PJ, Woolmer G (2004) Historical Observations of Humpback and Blue Whales in the North Atlantic Ocean: Clues to Migratory Routes and Possibly Additional Feeding Grounds. Marine Mammal Science 20: 774-786.

Waring GT, Josephson E, Maze-Foley K, Rosel PE, eds. (2011) U.S. Atlantic and Gulf of Mexico Marine Mammal Stock Assessments - 2010. NOAA Tech Memo NMFS NE 219; 595 p.


[^0]:    *For questions, or to offer feedback about this model or report, please contact Jason Roberts (jason.roberts@duke.edu)

