# 4. Summary and diagnostics



offshore-wind.github.io/narwind/articles/model summary.html

#### **Preamble**

This tutorial demonstrates how to inspect and summarize outputs from the agent-based model within the narwind R package.

### Viewing data

Outputs from the <a href="marw()">narw()</a> simulator can be viewed in the R console using the <a href="marwing-rint()">print()</a>. method. <a href="mailto:print()">print()</a> is part of a group of generic R functions that can be applied to various R objects and will behave differently depending on the type of object that is passed to them. Other generic functions include <u>plot()</u>, <u>summary()</u>, or <u>write()</u> (among others) – these are covered in later sections.

print() can also be called 'implicitly', that is, by simply typing the name of the relevant object in the R console and pressing [Enter] on the keyboard. The default behavior for objects returned by <u>narw()</u> is to give a tabular overview of the data from the first 5 days of the simulation, and for the first animal in each population cohort. For instance, to get a quick overview of the outputs from the baseline\_model created in the previous tutorial, we can type:

model\_base

Optional arguments allow users to override these default settings and display data for specific days, animals, and/or cohorts, as needed. The print() method has the following arguments:

Argument	Default value	Description
obj	-	Input model object returned by <a href="mailto:narw(">narw(")</a> .
rowID	1:5	Positive integer or vector of positive integers indicating which days of the simulation should be displayed. Defaults to the first first days.
whale	1	Positive integer indicating the individual for which data should be extracted. Only the first individual is included by default.

Argument	Default value	Description
cohort	1:6	Positive integer or vector of positive integers indicating which cohorts should be considered. Defaults to all cohorts. Cohort identifiers are listed in an object called cohorts. Note that calves are included with their mothers (i.e., cohort = 5).

Given the above, the code below displays the first 5 days of the simulation for the fourth adult male.

```
print(model_base, rowID = 1:5, whale = 4, cohort = 3)
#>
#>
#>
#>
______
#> Adults (male)
______
=======
#>
#> -----
#> Locations
#> -----
#>
#>
    whale day date easting northing region resid_m resid_sd pleave
#> 1:
        4 1 01-10 685.5000 761.5000
                                  SNE
                                          20.4
                                                   1.1
#> 2:
        4 2 02-10 684.7295 764.8358
                                    SNE
                                          20.4
                                                   1.1
                                                           0
#> 3:
          3 03-10 687.2660 773.6351
                                    SNE
                                          20.4
                                                   1.1
                                                           0
        4 4 04-10 683.5151 771.7780
#> 4:
                                    SNE
                                         20.4
                                                   1.1
#> 5:
       4 5 05-10 689.2974 774.0483 SNE 20.4
                                                   1.1
                                                           0
#>
#> -----
#> Attributes
#> ------
    whale day cohort gsl seus alive age
                                         bc
#>
                                                  length length_a
        4
           1
                 3 0
                       0 1 40.66953 0.3690396 13.62421 1362.755
#> 1:
#> 2:
                 3
                   0
                         0
                              1 40.67227 0.3692364 13.62422 1362.755
           2
#> 3:
        4
           3
                 3
                     0
                         0
                              1 40.67501 0.3692556 13.62422 1362.755
#> 4:
          4
                 3 0
                        0
                              1 40.67775 0.3693437 13.62422 1362.755
        4
                        0
#> 5:
        4
           5
                 3
                     0
                              1 40.68049 0.3693518 13.62422 1362.755
     length_b length_c mass leanmass fatmass
                                              mass a
                                                     mass b
                                                            mouth_r
      -0.37 -0.18 29128.91 18379.19 10749.72 -4.834189 2.984353 0.1459854
#> 1:
#> 2:
       -0.37
               -0.18 29138.01 18379.20 10758.81 -4.834189 2.984353 0.1459854
       -0.37
              -0.18 29138.91 18379.20 10759.71 -4.834189 2.984353 0.1459854
#> 3:
              -0.18 29142.99 18379.21 10763.78 -4.834189 2.984353 0.1459854
#> 4:
       -0.37
#> 5:
       -0.37
               -0.18 29143.37 18379.22 10764.16 -4.834189 2.984353 0.1459854
    mouth_a mouth_w abort starve died date_died p_surv
       76.7 1.988936
                            0
#> 1:
                       0
                                 0
#> 2:
       76.7 1.988936
                             0
                       0
                                 0
                                         0
                                                1
#> 3:
      76.7 1.988936
                             0
                                         0
                       0
                                 0
                                               1
#> 4:
       76.7 1.988936
                       0
                             0
                                 0
                                         0
                                                1
#> 5:
       76.7 1.988937
                     0
                            0
                                0
                                         0
                                               1
#>
#> -----
#> Stressors
#>
     whale day gear_risk is_entql entql_head entql_sev entql_d entql_start
#>
#> 1:
        4
           1
                    0
                            0
                                     0
                                              0
                                                     0
                                                               0
#> 2:
        4
           2
                    0
                            0
                                     0
                                              0
                                                     0
                                                               0
#> 3:
           3
        4
                    0
                            0
                                     0
                                              0
                                                     0
                                                               0
#> 4:
        4
           4
                    0
                            0
                                              0
                                                               0
           5
#> 5:
                    0
        4
                            0
                                     0
                                              0
                                                     0
     entgl_end is_entgl_calf entgl_head_calf entgl_sev_calf entgl_d_calf
#>
```

```
#> 1:
            0
#> 2:
            0
                        0
                                      0
                                                   0
                                                               0
#> 3:
            0
                        0
                                      0
                                                   0
                                                               0
            0
#> 4:
                        0
                                      0
                                                   0
                                                               0
#> 5:
            0
                        0
                                      0
                                                   0
#> entgl_start_calf entgl_end_calf strike_risk strike strike_calf noise_resp
#> 1:
                  0
                                         0
                                                0
                               0
                                                          0
#> 2:
                               0
                                                          0
                  0
                                         0
                                                0
                                                                    0
#> 3:
                  0
                               0
                                         0
                                                0
                                                          0
                                                                    0
#> 4:
                  0
                               0
                                         0
                                                0
                                                          0
                                                                    0
#> 5:
                  0
                               0
                                         0
                                                0
                                                          0
#> noise_lvl dB_thresh
#> 1:
            0
#> 2:
            0
#> 3:
            0
                     0
#> 4:
            0
#> 5:
            0
#>
#> -----
#> Activity budgets
#> -----
#>
    whale day d_travel swimspeed glide glide_feed glide_echelon t_travel
#>
#> 1:
      4 1 3.423671 0.7599443 0.08832360 0.2232512
                                                            0 1.251433
#> 2:
        4 2 9.157525 1.1813921 0.08533398 0.2958658
                                                            0 2.153186
#> 3:
       4 3 4.185526 0.8862305 0.08746686 0.5911404
                                                            0 1.311900
        4 4 6.212131 0.7800888 0.08805436 0.4770002
#> 4:
                                                            0 2.212046
#> 5:
        4 5 7.392055 1.0094592 0.08695322 0.2709297
                                                            0 2.034108
     t_feed t_rest_nurse
#> 1: 16.26587
                6.482699
#> 2: 15.69783
                6.148987
#> 3: 16.76200
               5.926096
#> 4: 16.56145
               5.226507
#> 5: 15.23622
               6.729675
#>
#> -----
#> Growth
#> -----
#>
     whale day delta_fat EDlip EDpro lip_anab lip_catab perc_muscle
#>
#> 1:
        4 1 10.1698638 39.539 23.64
                                   0.8 0.8 0.5537975
#> 2:
        4 2 9.0891762 39.539 23.64
                                      0.8
                                                0.8 0.5537975
        4 3 0.8916973 39.539 23.64
                                               0.8 0.5537975
#> 3:
                                      0.8
#> 4:
        4 4 4.0747901 39.539 23.64
                                      0.8
                                               0.8 0.5537975
        4 5 0.3762128 39.539 23.64
                                               0.8 0.5537975
#> 5:
                                      0.8
#> perc_viscera perc_bones
#> 1: 0.2009494 0.2452532
#> 2:
       0.2009494 0.2452532
#> 3:
      0.2009494 0.2452532
      0.2009494 0.2452532
#> 4:
#> 5:
       0.2009494 0.2452532
#>
#> -----
#> Energy balance
#> -----
#>
```

```
whale day
                   E_tot
                             E_in
                                     E_out
             1 502.63280 990.0397 487.4069
#> 1:
         4
#> 2:
             2 449.22117 1002.6947 553.4736
             3 44.07103 534.0915 490.0205
#> 3:
#> 4:
         4
           4 201.39141 696.4399 495.0485
         4 5 18.59385 552.1606 533.5668
#> 5:
#>
#> ------
#> Energy intake
#> -----
#>
#>
     whale day feed preyconc minprey gape feedspeed captEff impedance
                 1 3.886321 0.4686015 2.676211 0.7599443 0.91575
#> 1:
             1
#> 2:
                 1 2.631467 0.4686015 2.676212 1.1813921 0.91575
#> 3:
         4
                 1 1.754626 0.4686015 2.676213 0.8862305 0.91575
                                                                       0
#> 4:
                 1 2.631467 0.4686015 2.676214 0.7800888 0.91575
         4
#> 5:
                  1 1.754626 0.4686015 2.676215 1.0094592 0.91575
     feed_effort eta_lwrBC eta_upprBC targetBC
                                                              cop_kJ digestEff
#>
                                                 cop_mass
#> 1:
       0.4904317
                       10
                                  30 0.3674076 0.001670151 0.02391922
                                                                         0.94
#> 2:
       0.4889457
                       10
                                  30 0.3674076 0.001670151 0.02391922
                                                                         0.94
                                  30 0.3674076 0.001670151 0.02391922
#> 3:
     0.4876203
                       10
                                                                         0.94
#> 4:
                                  30 0.3674076 0.001670151 0.02391922
       0.4874909
                       10
                                                                         0.94
#> 5:
       0.4868979
                       10
                                  30 0.3674076 0.001670151 0.02391922
                                                                         0.94
#>
    metabEff_juv metabEff_ad
                                  E cop
#> 1:
        0.7403977
                       0.875 0.004762958
#> 2:
        0.7403977
                       0.875 0.004762958
#> 3:
        0.7403977
                       0.875 0.004762958
#> 4:
        0.7403977
                       0.875 0.004762958
        0.7403977
                      0.875 0.004762958
#> 5:
#>
#> -----
#> Energetic costs
#>
                                   LC scalar_LC stroke stroke_feed
#>
     whale day E_out
                           rmr
         4 1 487.4069 461.2304 26.07615
                                               1 0.10982960
#> 1:
                                                               0.1609924
#> 2:
         4
             2 553.4736 461.2305 92.14276
                                               1 0.14646990
                                                               0.1678607
#> 3:
         4
             3 490.0205 461.2307 28.68960
                                               1 0.09891408
                                                               0.1725391
             4 495.0485 461.2308 33.71755
                                               1 0.07163653
                                                               0.1636737
             5 533.5668 461.2309 72.23578
                                               1 0.14700101
#> 5:
                                                               0.1642192
#>
      E_growth
#> 1: 0.1003045
#> 2: 0.1002551
#> 3: 0.1002057
#> 4: 0.1001564
#> 5: 0.1001070
```

**Note 4.1:** The <u>print()</u> method is only used for viewing data inside the R console. To export / save data on disk, use the <u>export()</u> method (see relevant tutorial).

## Model summary and diagnostics

The <u>summary()</u> method provides a range of diagnostics that are helpful for assessing whether simulated whale behavior aligns with biological expectations. These relate to individual (1) health, (2) movements, (3) habitat use, (4) behavior (i.e., activity budgets), (5) stressor exposure, and (6) energy intake vs. expenditure (see Table 1 below).

The function takes the following arguments:

Argument	Default value	Description
obj	-	Model object of class narwsim, as returned by <a href="mailto:narw()">narw()</a> .
what	"all"	Character string indicating which component(s) of the summary to display. Can be one of: "health", "movements", "habitat", "behavior", "stressors", "strike", "gear", "noise", "other", or "energy". See below for details. Defaults to "all" for a complete summary.
relative	FALSE	Logical. If TRUE, percentages are calculated relative to class totals. Defaults to FALSE.
quintile	TRUE	Logical. If TRUE, body condition plots (under the "health" section) are based on quintiles of the data.
plot	FALSE	Logical. If TRUE, plots are produced in addition to a text-based summary.
whale	1:nsim	Positive integer indicating the individual for which data should be extracted. By default, considers all nsim individuals.
cohort	1:6	Positive integer or vector of positive integers indicating which cohorts should be considered. Defaults to all cohorts. Cohort identifiers are listed in an object called cohorts.

As summaries tend to be long and dense, the what argument can be used to select subsets of data to show in the R console. The table below lists the information returned for each possible value of what.

Category	Component	Plots	Details
health	Mortality	No	Whale mortality by region, cohort, and cause of death (i.e., starvation vs. vessel strike).

Category	Component	Plots	Details
	Pregnancy	No	Observed abortion rate in females that started the simulation in a pregnant state.
	Births	No	Mean (range) date of calving events.
	Body condition	Yes	Time series of individual body condition (expressed as relative fat mass), by cohort.
	Growth	Yes	Growth curves, by cohort.
movements	Locations	No	Breakdown of (daily) locations by cohort, region, and country (U.S. vs. Canada).
	Destinations	No	Comparison of assigned vs. realized migratory destinations both within and across cohorts. Migratory endpoints include the Southeastern United States calving grounds (SEUS) and Canadian feeding grounds in the Gulf of St Lawrence (GSL).
	Step lengths	Yes	Summary of daily movements, reported as mean (± SD, range) distances traveled per day, by cohort. Distributions of daily step lengths are also visualized by region and as a whole.
	Migration	No	Summary of yearly movements, reported as mean (± SD, range) total distance covered over the time span of the simulation, by cohort.

Category	Component	Plots	Details
habitat	Occupancy	No	Cohort-specific summary of the numbers of animals visiting each region, and the number of regions visited by animals.
	Residency	No	Breakdown of days spent in each.
behavior	Activity budgets	Yes	Mean (± SD) hours spent engaging in each of the four categories of behavior considered in the model (i.e., traveling, resting, nursing, and feeding), by region. A visual breakdown by region is also produced for each category of behavior.
stressors	Entanglements (gear)	Yes	Various summaries by cohort, including: entanglement rates, durations, severities, probabilities, and attachment sites along the body.
	Vessel strikes (strike)	No	Strike rates by cohort.
	Noise (noise)	No	Summary of mean (± SD, range) noise levels encountered, behavioral response thresholds, and numbers of days during which a response to pile-driving was observed.
	Other sources of mortality (other)	No	Summary of mortality from other sources, by cohort.

Category	Component	Plots	Details
Energy	Energy budget	No	Mean (± SD, range) daily energy intake and expenditure (expressed in MJ/day), by cohort. Also reported are the mean (± SD, range) % time individuals are in energetic deficit (energy balance < 0) or surplus (energy balance > 0).

Similarly, the cohort argument can be used to only display data for specific population cohorts. This works based on a unique cohort ID number, which is an integer between 1 and 6. A list of cohort IDs is stored in the left-most column of an object called cohorts, as shown below:

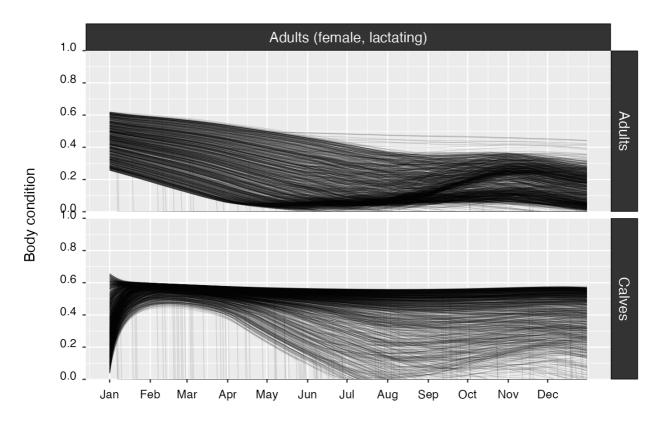
```
cohorts
#>
     id
                              name
                                      class
                                                abb colour
             Calves (male, female)
                                      Calves c(m, f)
                                                      black
#> 1: 0
                  Juveniles (male) Juveniles jv(ml) #104E8B
#> 2: 1
                Juveniles (female) Juveniles jv(fml) #F69554
#> 3: 2
#> 4: 3
                     Adults (male)
                                     Adults ad(ml) #22BA9C
#> 5: 4 Adults (female, pregnant)
                                     Adults ad(f,p) #84375A
#> 6:
      5 Adults (female, lactating)
                                     Adults ad(f,1) #EEB422
#> 7:
          Adults (female, resting)
                                     Adults ad(f,r) #942F33
```

Based on this, the code below prints a complete summary (all categories of data listed in the above table) for the cohorts of lactating (ID = 5) females:

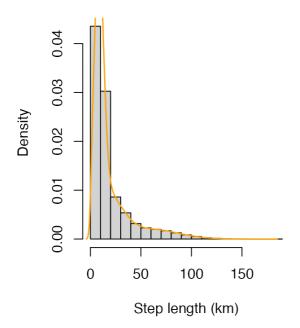
```
# Summary for adult females only
summary(model_base, cohort = 5)
#> -----
#> -----
     NORTH ATLANTIC RIGHT WHALE (Eubalaena glacialis)
#>
#>
          *** PCoMS MODEL SUMMARY ***
#>
#>
#> ------
#> ------
#>
#> BOF: Bay of Fundy
#> CCB: Cape Cod Bay
#> CST: Cabot Strait
#> GMAN: Grand Manan Basin
#> GOM: Gulf of Maine and Georges Bank
#> GSL: Gulf of St Lawrence
#> MIDA: Mid-Atlantic
#> SCOS: Scotian Shelf
#> SEUS: Southeastern United States
#> SNE: Southern New England
#>
#> SIMULATIONS
#>
#> No. animals: 1,000
#>
#> Cohort(s)
#> -----
#> c(m,f): Calves (male, female)
#> ad(f,1): Adults (female, lactating)
#>
#> Simulation start: October
#>
#> HEALTH
#>
#> ++++++++
#>
#> cohort
                   alive dead
#> ----- --- ------
#> Adults (female, lactating) 92.4% (924) 7.6% (76)
#> Calves (male, female) 82.6% (826) 17.4% (174)
#>
#> ++++++ Mortality (by source) +++++++
#>
#> cohort cause_death
#> -----
#> ad(f,1) starve
                   4.5% (45)
                   1.8% (18)
#> ad(f,1) natural
#> ad(f,1) strike
                   1.3% (13)
#> c(m,f) starve
#> c(m,f) natural
                   8.2% (82)
                   2.7% (27)
```

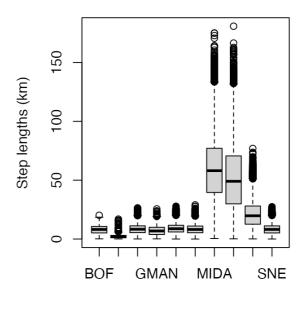
```
#> c(m,f)
          starve (female) 2.7% (27)
          natural (female)
#> c(m,f)
                         1.7% (17)
#> c(m,f)
        strike (female) 1.2% (12)
        strike
#> c(m,f)
                         0.9% (9)
#>
#> +++++++ Mortality (by region) +++++++
#>
#> region cause_death ad(f,1)
                              c(m,f)
#> -----
#> CST
         natural
                    0.0% (0) 0.6% (1)
#> GOM
        natural
                   3.9% (3) 4.0% (7)
#> GSL
                   3.9% (3) 1.1% (2)
       natural
#> MIDA
      natural
                   1.3% (1) 0.6% (1)
#> SCOS
        natural
                   2.6% (2) 2.9% (5)
#> SEUS
      natural
                   9.2% (7) 4.6% (8)
       natural 2.6% (2) 1.7% (3)
#> SNE
#>
#>
                        ad(f,1) c(m,f)
#> region
         cause_death
                        -----
#> ----
         -----
#> GOM
         natural (female)
                        0.0% (0) 1.7% (3)
#> GSL
         natural (female) 0.0% (0) 1.7% (3)
#> MIDA
      natural (female) 0.0% (0) 0.6% (1)
#> SCOS
        natural (female) 0.0% (0) 1.1% (2)
#> SEUS
         natural (female) 0.0% (0) 4.0% (7)
#> SNE
         natural (female) 0.0% (0)
                                  0.6% (1)
#>
#>
#> region cause_death ad(f,1)
                             c(m,f)
#> -----
#> CCB
                   1.3% (1)
                              0.0% (0)
         starve
#> CST
         starve
                   13.2% (10) 7.5% (13)
        starve
#> GMAN
                   1.3% (1) 1.1% (2)
#> GOM
        starve
                   6.6% (5) 12.6% (22)
                    3.9% (3) 2.9% (5)
#> GSL
         starve
#> MIDA
                   2.6% (2) 3.4% (6)
        starve
                   13.2% (10) 18.4% (32)
#> SCOS
        starve
#> SNE
                   17.1% (13) 1.1% (2)
         starve
#>
#>
#> region
        cause_death ad(f,1) c(m,f)
#> -----
                      _____
#> CST
         starve (female)
                       0.0% (0)
                                 1.7% (3)
#> GMAN
         starve (female)
                       0.0% (0)
                                 0.6% (1)
#> GOM
         starve (female)
                       0.0% (0)
                                2.9% (5)
#> GSL
        starve (female) 0.0% (0)
                                0.6% (1)
#> MIDA
        starve (female)
                       0.0% (0)
                                1.1% (2)
                                 5.2% (9)
#> SCOS
        starve (female)
                       0.0% (0)
#> SNE
         starve (female)
                       0.0% (0) 3.4% (6)
#>
#>
#> region cause_death ad(f,1)
                              c(m,f)
#> -----
                    -----
                             -----
#> GMAN
         strike
                   0.0% (0)
                              0.6% (1)
#> GOM
                   1.3% (1)
                              0.0\% (0)
         strike
#> GSL
        strike
                   1.3% (1)
                              0.0% (0)
```

```
#> MIDA
           strike
                         0.0% (0)
                                     0.6% (1)
#> SEUS
           strike
                         6.6%
                              (5)
                                     2.9%
                                          (5)
#> SNE
           strike
                         7.9% (6)
                                     1.1% (2)
#>
#>
#> region
           cause_death
                             ad(f,1)
                                         c(m, f)
#> ----
#> GOM
           strike (female)
                             0.0% (0)
                                         0.6% (1)
                                         0.6% (1)
#> GSL
           strike (female)
                             0.0%
                                  (0)
#> SEUS
           strike (female)
                             0.0%
                                   (0)
                                         2.9% (5)
#> SNE
           strike (female)
                                  (0)
                             0.0%
                                         2.9% (5)
#>
#>
#> ++++++++ Births +++++++
#>
#> No. births: 1000 (100%)
#> DOB: 1 Jan
```



## Adults (female, lactating)



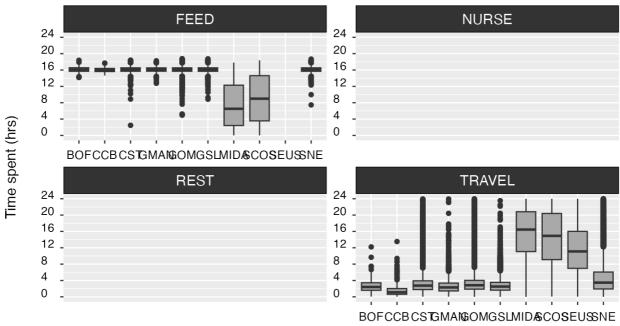


```
#> +++++++ Migratory destinations (by cohort) +++++++
#>
#> cohort SEUS reach_not reach
#> -----
#> ad(f,1) 0 0.0% (0) 100.0% (947)
#> ad(f,1) 1 0.0% (0) 100.0% (1000)
#>
#>
#> cohort GSL reach_not
                      reach
#> -----
#> ad(f,1) 0 86.5% (1038) 13.5% (162)
\# ad(f,1) 1
            5.1% (38) 94.9% (709)
#>
#> ++++++ Migratory destinations (all individuals) ++++++++
#>
#> SEUS reach_not
               reach
#> -----
#> 0
     0.0% (0) 100.0% (947)
      0.0% (0) 100.0% (1000)
#> 1
#>
#>
#> GSL
     reach_not reach
#> ----
   86.5% (1038) 13.5% (162)
#> 1
    5.1% (38) 94.9% (709)
#>
#> +++++++ Step lengths and migration distances ++++++++
#>
#> cohort step
                        migration
#> -----
#> ad(f,1) 18.9 (±21) [0-180.8] 8,516 (±1,052) [2,186-11,895]
#>
#> HABITAT USE
#>
\# region ad(f,1)
#> -----
#> B0F
       0.1% (351)
#> CCB
      0.1% (442)
#> CST 4.9% (21970)
#> GMAN
      0.8% (3459)
#> GOM
       20.9% (92730)
       9.4% (41809)
#> GSL
#> MIDA
       8.5% (37875)
#> SCOS
       7.4% (32939)
#> SEUS
       23.3% (103702)
#> SNE
       24.6% (109103)
#>
#>
#> country ad(f,1)
#> -----
#> Canada 22.6% (100528)
#> U.S. 77.4% (343852)
#>
```

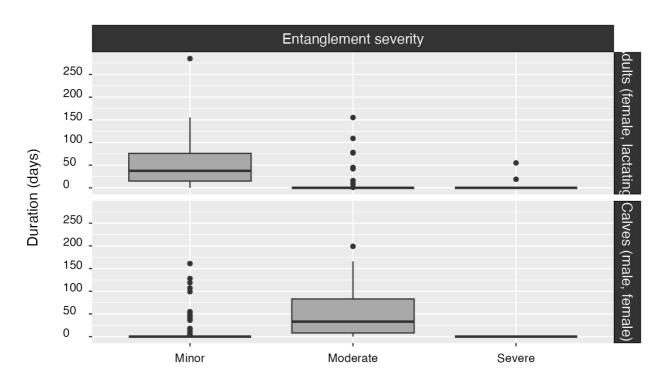
```
#> +++++++ Number of animals visiting each region (N = 1000) +++++++++
#>
\# region ad(f,1)
#> -----
#> B0F
        2.9% (29)
#> CCB 0.8% (8)
#> CST 56.3% (563)
#> GMAN 13.9% (139)
#> GOM
        98.2% (982)
#> GSL
        43.7% (437)
#> MIDA 100% (1000)
#> SCOS 94.3% (943)
#> SEUS 100% (1000)
#> SNE
         100% (1000)
#>
#> +++++++ Days spent in each region ++++++++
#>
\# region ad(f,1)
#> -----
#> B0F
         12.1 (±9.4) [1-34]
#> CCB
        55.2 (±52.6) [5-130]
#> CST
         39 (±14.9) [2-93]
#> GMAN
        24.9 (±14.1) [1-92]
#> GOM
         94.4 (±49.1) [1-245]
#> GSL
         95.7 (±42.2) [1-180]
#> MIDA
         37.9 (±9.9) [13-136]
#> SCOS 34.9 (±19.4) [1-114]
#> SEUS 104.1 (±14.5) [45-146]
#> SNE
         109.1 (±37.5) [34-313]
#>
#> +++++++ Total number of regions visited ++++++++
#>
\#> No.regions ad(f,1)
#> -----
         3 100.0% (18)
#>
#>
         4 100.0% (39)
         5 100.0% (278)
#>
         6 100.0% (173)
#>
#>
         7 100.0% (474)
         8 100.0% (17)
#>
#>
          9 100.0% (1)
#>
#> ACTIVITY BUDGETS
#>
#> +++++++ Adults (female, lactating) +++++++
#>
#> region travel (hrs) rest/nurse (hrs) feed (hrs)
#> -----
#> SNE
       4.64 (\pm 4.02) 12.52 (\pm 6.93) 16.11 (\pm 0.62)
#> MIDA 15.56 (±6.01) 7.68 (±6.16)
#> SEUS 11.61 (±5.81) 12.39 (±5.81)
                                       7.44 (±5.45)
                                      0 (\pm 0)
#> GOM
        3.3 (±2.4) 6.57 (±4.65)
                                      16.11 (±0.64)
#> SCOS 14.46 (±6.47) 1.33 (±3.27) 8.87 (±5.59) 
#> CCB 1.61 (±1.58) 20.1 (±5.92) 16.07 (±0.66)
```

#>	GMAN	2.71 (±2.12)	8.48 (±6.53)	16.11 (±0.61)
#>	CST	3.18 (±2.35)	7.42 (±5.6)	16.11 (±0.64)
#>	GSL	2.72 (±1.56)	5.59 (±3.04)	16.11 (±0.63)
#>	BOF	2.62 (±1.52)	5.5 (±2.33)	16.11 (±0.64)

### Adults (female, lactating)







```
#> ++++++++ Entanglements +++++++
#>
#> entangled rate
#> -----
       91.2% (1825)
8.8% (175)
#> no
#> yes
#>
#>
#> position rate
#> -----
        51.4% (90)
#> body
#> head
        48% (84)
#> head
        0.6% (1)
#>
#>
#> -----
#> ad(f,1) 91.0% (910)
                  9.0% (90)
#> c(m,f) 91.5% (915) 8.5% (85)
#>
#>
#> cohort No. events per animal p(entangled)
#> -----
\#> ad(f,1) 1.06 (±0.27) [1-3] 0 (±0.002) [0-0.217]
\# c(m, f) 1 (±0) [1-1]
#>
#>
#> cohort minor
                moderate
                         severe
#> -----
\#> ad(f,1) 87.9% (80) 9.9% (9) 2.2% (2)
#> c(m,f) 18.8% (16) 81.2% (69) 0.0% (0)
#>
#>
#> cohort minor (days) moderate (days) severe (days)
#> -----
\# ad(f,1) 57 (±46) [1-285] 59 (±51) [1-155] 37 (±25) [19-55]
\# c(m,f) 59 (±49) [4-161] 60 (±46) [4-199] 0 (±0) [0-0]
#>
#>
#> +++++++++ Vessel strikes ++++++++
#>
#> strike rate
#> -----
#> no
       98.9% (1978)
#> yes
      1.1% (22)
#>
#>
#> cohort not struck struck
#> -----
#> ad(f,1) 98.7% (987) 1.3% (13)
#> c(m,f) 99.1% (991) 0.9% (9)
#>
#>
#> cohort p(strike)
#> -----
```

```
\#> ad(f,1) 2.85e-05 (±7.12e-05) [0-0.0037253]
#>
#>
#> +++++++ Other sources of mortality +++++++
#>
#> mortality rate
#> -----
#> alive
        97.6% (1952)
#> dead
         2.4% (48)
#>
#>
#> cohort alive
                 dead
#> -----
#> ad(f,1) 98.2% (982) 1.8% (18)
#> c(m,f) 97.0% (970) 3.0% (30)
#>
#>
#> ++++++++ Pile-driving noise ++++++++
#>
#> cohort noise level
                         response threshold
                                           response
Duration (days)
#> ----- --- ----- ------
\# ad(f,1) 63.438 (±32.414) [0-80] 119.8 (±64.5) [0-199.9] - (0) 0
(±0) [0-0]
#>
#> ENERGY BUDGETS (MJ per day)
#>
#> cohort Energy_intake
                             Energy_expenditure
#> -----
\# ad(f,1) 739.7 (±1,358.7) [0-15,322.1] 1,938.7 (±820.8) [426.8-6,222.9]
#> c(m,f) 1,311.8 (±631.8) [0-3,392.7] 519.2 (±134.8) [241.9-1,910.5]
#>
#>
#> cohort Deficit
                          Surplus
#> -----
#> ad(f,1) 81.2% (±9.6) [50.8-100] 18.8% (±9.6) [0-49.2]
#> c(m,f) 16.7% (±18.6) [0.3-64.7] 83.3% (±18.6) [35.3-99.7]
```

## Plotting model outputs

Several plots can be obtained from the outputs of the agent-based model – all are produced using the plot() method, which takes the following arguments:

Argument	Default value	Description
obj	-	Model object of class narwsim, as returned by <a href="mailto:narw()">narw()</a> .
what	"map"	Character string indicating which plots to return.

Argument	Default value	Description
whale	1:nsim	Positive integer or vector of integers indicating the individual(s) for which data should be extracted. By default, the function plots tracks for all nsim simulated animals.
cohort	1:6	Positive integer or vector of positive integers indicating which cohorts should be considered. Defaults to all cohorts. Cohort identifiers are listed in an object called cohorts.
web	FALSE	Logical. Whether to produce static maps (FALSE) or interactive, web-based maps (TRUE).
nL	100	Positive integer. Number of tracks to plot (when what = "map") or number of draws to plot from the Bayesian posterior distribution of survival, health, and gestation models (when what = "pred"). In the former case, this argument should be kept < 100 to minimize memory usage and avoid lengthy run times.
lwd	0.2	Numeric value. Thickness of the lines used to illustrate movement tracks.
alpha	0.7	Numeric value between 0 and 1. Level of transparency of the tracks.

### Plot type

By default, a call to <u>plot()</u> will automatically generate maps of simulated whale tracks, with labels indicating the locations of births (in green, if relevant) and deaths (color-coded by cause of mortality). This behavior is controlled by the <u>what</u> argument, which is preset to "map". what may also be set to "pred" to visualize how survival and body condition are predicted to vary as a function of individual health (see next Tutorial 5).

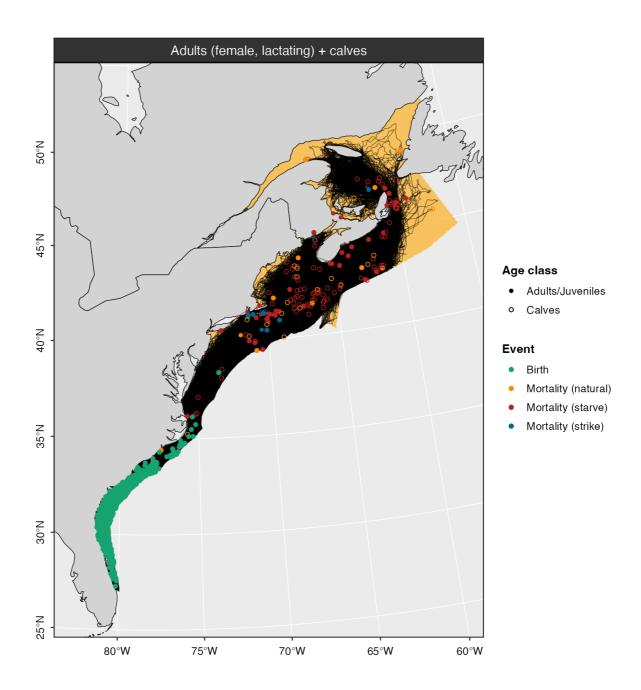
#### Number of tracks

The number of tracks shown is limited to a maximum of nL = 100 to improve legibility and ensure that the code runs smoothly. We recommend against modifying this default setting, unless absolutely necessary (i.e., fewer/more tracks can be displayed by decreasing or increasing value passed to the nL argument).

#### Subsets of data

Similarly to the other methods described in preceding sections, the cohort and whale arguments can be used to display data for particular cohorts and/or individuals of interest.

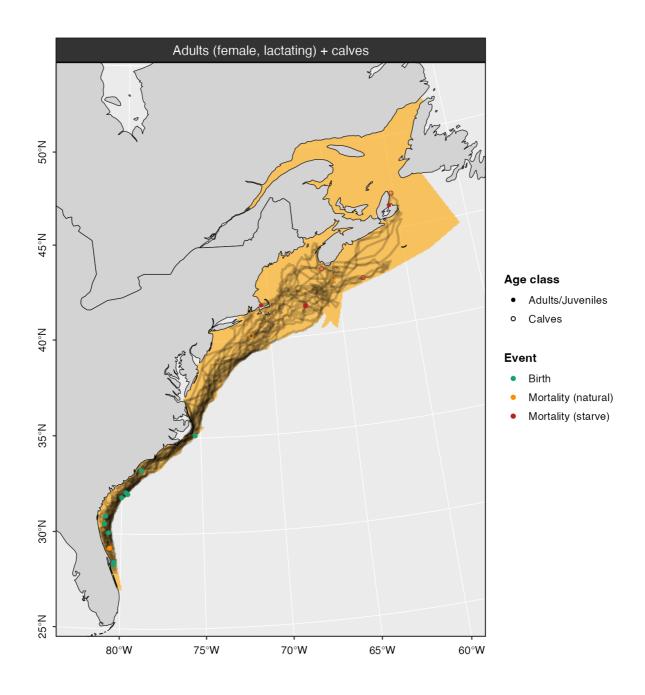
plot(model\_base, cohort = 5)
#> Warning in plot.narwsim(model\_base, cohort = 5): Plotting only the first 100
#> tracks



### Plot aesthetics

The thickness and transparency of track lines can be changed via the <a href="lwd">lwd</a> and <a href="alpha">alpha</a> arguments, respectively. Lower values of <a href="lwd">lwd</a> produce thinner lines, and lower values of <a href="alpha">alpha</a> increase transparency.

plot(model\_base, cohort = 5, whale = 1:10, alpha = 0.2, lwd = 1)



### **Interactive maps**

Lastly, when web is set to TRUE, interactive web-based maps are produced using the <a href="mailto:ggplotly">ggplotly</a> R package. These can be zoomed and panned using the mouse cursor to get a closer look at specific areas of interest. The location (easting, northing) and ID of each animal are displayed upon mouse hover.