Title

Bayesian inference of toothed whale lifespans

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Abstract

Accurate measures of lifespan and age-specific mortality are important both for understanding life-history evolution and informing conservation and population management strategies. The most accurate data to estimate lifespan are from longitudinal studies, but for many species – especially those such as toothed whales that are wide-ranging and live in difficult-to-access environments - these longitudinal data are not available. However, other forms of age-structured data – such as from mass-strandings - are available for many toothed species, and using these data to infer patterns of age-specific mortality and lifespan remains an important outstanding challenge. Here we develop and test a Bayesian mortality model to derive parameters of a mortality function from age-structured data while accounting for potential error introduced to these data by mistakes in age estimation, sampling biases and population growth. We then searched the literature to assemble a database of 269 published age-structured toothed whale datasets. We applied our mortality model to derive lifespan estimates for 32 species of female and 33 species of male toothed whale. We also use our model to characterise sex differences in lifespan in toothed whales. Our mortality model allows us to curate the most complete and accurate collection of toothed whale lifespans to date.

Introduction

Quantifying age-specific mortality risk – the hazard of an individual dying given their age – is fundamental to the study of life-history evolution (Shefferson et al. 2017) as well as vital to informing conservation and population management strategies (Wade 2018). Data from longitudinal studies of individually identified individuals are the benchmark for calculating age-specific mortality risk. Tracking large numbers of individuals from birth to death can give an unbiased measure of age-specific mortality risk over the time period the observations were conducted (Caughley 1966; Hamlin et al. 2000; Nuñez et al. 2008; Gaillard et al. 2017). Although the number of species for who these data are available is increasing (e.g. (Salguero-Gómez et al. 2016; Lemaître et al. 2020)) they are still rare and hard to collect, especially for long-lived and difficult-to-study species in the wild.

Toothed whales (Odontocetes) are long-lived and, due to their wide-ranging marine habitats, difficult to follow longitudinally through their life. This presents a difficulty because characterising the age-specific mortality of toothed whale species is important to inform conservation efforts. Cetacean populations are subject to a variety of stressors including fisheries bycatch (Lewison et al. 2004), whaling (Clapham et al. 2007), pollution (Reijnders et al. 2018), anthropogenic noise (National Research Council 2005) and a changing climate (van Weelden et al. 2021; Kebke et al. 2022). Models of population change in response to stressors need to be parametrised by measures of mortality. As well as conservation implications, toothed whales represent an important case study of the links between sociality and life history - particularly as they show a diversity of social systems and life histories (Connor et al. 1998; Whitehead and Mann 2000; Gowans et al. 2007; Weiss et al. 2021) including being the only mammalian taxa where menopause has evolved multiple times (Ellis et al. 2018a, b). It is therefore important to develop robust measures of lifespan that can be applied to toothed whales.

Although long-term longitudinal mortality data are rare in toothed whales, age-structured data are relatively common. Toothed whales can be aged by counting the growth rings in a cross-section of a tooth (Perrin and Myrick 1980; Read et al. 2018). This characteristic, along with a tradition of collecting detailed anatomical data from deceased whales (for example from mass-strandings, or fisheries by-catch), has resulted in the widespread publication of age distributions of samples of toothed whales. These data have been an important - and in many species the only - source of information on demography, life history and behaviour in toothed whales. However, because data are cross-sectional they have the potential to be biased as a measure of lifespan. In particular, three sources of error in cross-sectional mortality data have been identified: population growth or shrinking, sampling biases and age-estimation error (Caughley 1966; Hamlin et al. 2000; Nuñez et al. 2008; Gaillard et al. 2017). Population change (growth or reduction) will affect the realised age distribution of a sample independently of patterns of mortality. For example, when a population is increasing younger individuals will be over-represented in a given sample. Conversely, if a population is shrinking then older individuals will be over-represented. Sampling biases may be introduced into the reported age distribution of whales both at the point of mortality- for example if younger individuals are more likely to be caught as fisheries bycatch – and during the sample – for example, if larger, older, whales are preferentially selected for anatomical sampling. Similarly, and as with any data collection methodology, errors in age estimation may be introduced during the process of counting growth rings in the teeth. Any method using age-structured data to derive age-specific mortality requires a mechanism to propagate error through to the final mortality parameter estimates.

In this study, we develop, test and apply a method that uses age-structured data to derive estimates of age-specific mortality for toothed whale species. Specifically, we develop a Bayesian mortality model to estimate the parameters of a mortality function from age-structured data, while capturing variation in these values introduced by population growth, sampling biases and age-estimation errors. We then use large-scale simulation to test our mortality model. And lastly, we collate a database of age-

structured toothed whale data from the literature and apply our methods to get estimates of age-specific mortality for as many toothed whale species as possible. We also use our models to compare male and female lifespans across our sample. Throughout this study, we focus on lifespan as a tractable and biologically-relevant property of cumulative age-specific mortality.

Methods

Mortality model

The number of whales of age *i* in a sample will depend on four key variables (Nuñez et al. 2008; Gaillard et al. 2017): (1) the probability of a whale surviving to age *i*; (2) the population growth rate (positive or negative); (3) biases in sampling and (4) error in age estimation. The aim of our model is to get a distribution of potential parameter values for a mortality model (1) given the unknown magnitude and influence of the other effects (2-4). Our model, therefore, does not aim to get a single 'best estimate' for the lifespan of each species, but rather to generate a distribution of potential lifespans given the observed data and the other processes that might be influencing the observed data. Subsequently, the model is not designed to estimate the effects of (2-4) and in fact when fitted the posterior of parameters relating to (2-4) do not usually differ from their priors. The presence of these parameters in the model, however, means that the derived distribution of mortality parameters (1) are those most consistent with the data given the unknown effects 2-4.

In this section, we first describe the case of the model applied to a single dataset. We then move on to describe how this single dataset model can be generalised to combine data from multiple datasets, sexes and populations of the same species into a single model.

We consider the count, *c*, of whales of a given age *AGE* in a sample to be drawn from a multinomial distribution, with probability θ over *N* individuals. Where θ_i is a function of: survival to age AGE_i , L_i; the effect of population growth, R_i; and sampling biases at that age S_i (equation 1). Throughout this section *AGE* refers to age adjusted to age at maturity, so that age 0 is species- and sex-specific age at maturity.

Equation 1

$$c \sim Multinomial(\theta, N)$$
$$\theta_i = \frac{L_i R_i S_i}{\sum L_i R_i S_i}$$

1. Survival

We model the underlying probability of an individual surviving to age *i* as the survival curve (equation 2) derived from the Gompertz mortality model (Gompertz 1825).

Equation 2

$$l(i) = e^{-(\alpha/\beta)(e^{\beta \times AGE_i - 1})}$$

Where *α is* the baseline mortality and *β* is the increasing probability of mortality with age (ageing). As we are only modelling survival from age at maturity we do not use the Makeham/bathtub form of the Gompertz equation. We chose the Gompertz mortality model because it has few parameters, is widely used in studies of mammal senescence (Gaillard et al. 2017) and was recently found to be the most parsimonious mortality model in several killer whale populations (Nielsen et al. 2021).

The probability that a sampled individual is of age *i*, L_i is drawn from the probability density function of the survival equation. Hence:

Equation 3

$$L_i = \frac{e^{-\left(\alpha/\beta\right)\left(e^{\beta \times AGE_i - 1}\right)}}{\sum_{j=0}^{n} e^{-\left(\alpha/\beta\right)\left(e^{\beta \times AGE_j - 1}\right)}}$$

Where *n* is the maximum possible age, here we use *n* = 150 for all species.

As both Gompertz parameters are bounded between 0 and 1 we set up priors on α and β drawn from Beta distributions:

Equation 4

$$\alpha \sim \mathrm{Beta}(p\alpha_1, p\alpha_2)$$
$$\beta \sim \mathrm{Beta}(p\beta_1, p\beta_2)$$

For this study, $p\alpha_1 = 6.79$, $p\alpha_2 = 166.31$, $p\beta_1 = 9.91$, $p\beta_2 = 37.93$. These priors are centred on the mean of published Gompertz *alpha* and *beta* values for Artiodactyla, with a variance double that of the published data (Gaillard et al. 2004; Toïgo et al. 2007; Foote 2008).

2. Population growth rate

We model the increased probability of individuals of age *i* being observed due to population growth R_i as:

Equation 5

$$R_i = (1 - \rho)^{AGE_i}$$
$$\rho = \frac{r}{1/2 \times \max(o)}$$

Where *r* is the population growth parameter, with r = 0 representing a stable population, r>0 a growing population and r<0 a shrinking population. For simplicity, we assume that the population growth rate is constant, or at averages to a constant value, over the whole length of the study: *r*, therefore, represents annual population growth in any year of the study. *rho* is the growth parameter scaled to the maximum observed lifespan of the species *max(o)* so that the value of *r* can be directly compared between species and given a sensible and consistent prior. For example, r =0.1 means that the population will increase by 10% over half the maximum species lifespan. *Max(o)* is calculated from the raw data.

We use priors that allow us to leverage any data that may exist on the given population:

Equation 6

$$r \in [-0.5, 0.5] \sim \begin{cases} Normal(-0.25, 0.2) & pr = 1 \\ Normal(0, 1) & pr = 0 \\ Normal(0.25, 0.2) & pr = -1 \end{cases}$$

Where *pr = 1* indicates that there is strong evidence the population is growing, *pr = -1* that there is strong evidence that the population is shrinking and *pr=0* that the population growth status of the

population is unknown. Priors are moderately informative and limited between the population halving and doubling over half the maximum species lifetime.

3. Sampling bias

We model sampling biases as an increased or decreased probability that whales within a given window *W* are under or over sampled. The sampling bias age window *W* is a pre-determined input into the model. Within the range a sampling bias effect *s* is applied, thus:

Equation 7

$$S_i \sim \begin{cases} s+1 & AGE_i \in W \\ 1 & AGE_i \notin W \end{cases}$$

Where $s > 1$ indicates that ages within range *W* are more likely to be samples, s<0 that they are less likely to be sampled, and s=0 means no differences within and without the range.

The prior used for *s* in a given sample depends on whether the ages within the range are known to be over ($ps = 1$), under ($ps = -1$) sampled, or if the direction is unknown ($ps = 0$).

Equation 8

$$s \in [-1, 2] \sim \begin{cases} Normal(1, 0.5) & ps = 1 \\ Normal(0, 2) & ps = 0 \\ Normal(-1, 0.5) & ps = -1 \end{cases}$$

4. Age-estimation error

We consider the true age of each whale *j* in the sample, τ_j, to be drawn from a Gaussian distribution around the observed age o_j with standard deviation ε_j. Where B is species-sex specific age at maturity at +B corrects between the real observed age of the sample and the model age (where age at maturity is age 0).

Equation 9

$$\tau_j \sim Normal(o_j, \epsilon_j)$$
$$\epsilon_j = \frac{1}{20}(o_j + B)$$

We assume that the error is additive such that ε is 5% of the observed age, and therefore that there is a greater error around older samples than younger samples. 5% was chosen to reflect a reasonable error rate in counting tooth rings, but changing this variable within reasonable bounds does not qualitatively affect the model outcomes. The outcome of this is that for a sample with an observed age of 10 the model assumes that there is a 90% probability that the true age is between 9 and 11, and for a whale of observed age 50 there is a 90% chance the sample is between 45 and 55.

We use estimated true ages, rounded to the nearest integer (notation: $\lfloor x \rceil$), of all the whales in the sample (N) to calculate the counts *c* of whales of a given age *i* in each sample used for the rest of the model.

Equation 10

$$c_i = \sum_{k=1}^{N} [\,\lfloor \tau_k \rfloor = \mathrm{AGE}_i]$$

We combine these parts into a single model per species. Further, we design the model such that we run one model per species, combining multiple datasets and both sexes (where available). We estimate mortality parameters (α & β) for each sex with data from multiple datasets. Where multiple datasets are derived from the same population (most commonly, one for each sex) we estimate a single population growth parameter for these datasets. We calculate a separate sampling bias metric for each dataset. The complete model is shown below (notation key in table 1):

Equation 11

$$c \sim Multinomial(\theta, N)$$

$$\theta_{d,i} = \frac{L_{d,i} R_{d,i} S_{d,i}}{\sum L_{d,i} R_{d,i} S_{d,i}}$$

$$L_i = \frac{e^{-\left(\alpha_{SEX_d}/\beta_{SEX_d}\right)\left(e^{\beta_{SEX_d} \times AGE_{d,i}} - 1\right)}}{\sum_{j=0}^{n} e^{-\left(\alpha_{SEX_d}/\beta_{SEX_d}\right)\left(e^{\beta_{SEX_d} \times AGE_{d,j}} - 1\right)}}$$

$$R_{d,i} = (1 - \rho_d)^{AGE_{d,i}}$$

$$\rho_d = \frac{r_{POP_d}}{1/2 \times \max\left(o_{DSET_{SEX = SEX_d}}\right)}$$

$$S_{d,i} \sim \begin{cases} s_d + 1 & AGE_{d,i} \in W_d \\ 1 & AGE_{d,i} \notin W_d \end{cases}$$

$$\tau_j \sim Normal(o_j, \epsilon_j)$$

$$\epsilon_j = \frac{1}{20}(o_j + B)$$

$$c_{d,i} = \sum_{k=1}^{N} [\,\lfloor \tau_k \rfloor = \mathrm{AGE}_i, DSET = d]$$

$$\alpha \sim \mathrm{Beta}(p\alpha_1, p\alpha_2)$$

$$\beta \sim \mathrm{Beta}(p\beta_1, p\beta_2)$$

$$r_p \in [-0.5, 0.5] \sim \begin{cases} Normal(-0.25, 0.2) & pr_p = 1 \\ Normal(0, 1) & pr_p = 0 \\ Normal(0.25, 0.2) & pr_p = -1 \end{cases}$$

$$s_d \in [-1, 2] \sim \begin{cases} Normal(1, 0.5) & ps_d = 1 \\ Normal(0, 2) & ps_d = 0 \\ Normal(-1, 0.5) & ps_d = -1 \end{cases}$$

The model was implemented in STAN and R using functionality from the rstan, cmdstanr and rethinking packages (McElreath 2020; Stan Development Team 2020, 2021; R Development Core Team 2021). The model has been built into an R package - marinesurvival

(github.com/samellisq/marinesurvival) – which includes all R and STAN code necessary to implement the models.

Table 1. Explanation of symbols used in equation 1.

Symbol	Explanation
$\boldsymbol{i}$	Model variable. Index through possible ages (see AGE).
$\boldsymbol{d}$	Model variable. Index through datasets.
$\boldsymbol{j}$	Model variable. Index through samples.
$\boldsymbol{p}$	Model variable. Index through populations.
$\boldsymbol{n}$	Model variable. Total number of possible ages.
$\boldsymbol{N}$	Model variable. Total number of samples.
$\boldsymbol{c_{d,i}}$	Model variable. Count of samples in dataset *d* of age *i*
$\boldsymbol{L_i}$	Model variable. Probability of surviving to age *i*
$\boldsymbol{R_{d,i}}$	Model variable. Change in probability of finding a whale of age *i* given population growth in dataset *d*.
$\boldsymbol{S_{d,i}}$	Model variable. Change in probability of finding a whale of age *i* in dataset *d* due to sampling bias.
$\boldsymbol{\rho_d}$	Model variable. Change in population size over half the maximum lifespan of the whales in dataset *d*.
$\boldsymbol{\varepsilon_j}$	Model variable. Standard deviation around the observed age of sample *j*.
$\boldsymbol{o_j}$	Data. Observed age of sample *j*.
$\boldsymbol{SEX_d}$	Data. Sex of whales in dataset *d*.
AGE	Data. Vector of possible ages of whales in the sample. Here 0-150 (where 0 = age at maturity).
$\boldsymbol{POP_d}$	Data. Population to which dataset *d* belongs.
$\boldsymbol{DSET_j}$	Data. Dataset sample *j* is drawn from.
$\boldsymbol{W_d}$	Data. Window of ages with potential sampling bias in dataset *d*
$\boldsymbol{B_d}$	Data. Each at maturity of individuals in sample *d*.
$\boldsymbol{pr_p}$	Data. Prior belief in the direction of population growth in population *p*.
$\boldsymbol{ps_d}$	Data. Prior belief in the direction of bias for samples in $W_{d.}$
$\boldsymbol{p\alpha_{1\text{-}2}}$	Data. Shape parameters (1 & 2) describing the prior expectation for Gompertz α values derived from the literature. Here: $p\alpha_1 = 6.79$, $p\alpha_2 = 166.31$.
$\boldsymbol{p\beta_{1\text{-}2}}$	Data. Shape parameters (1 & 2) describing the prior expectation for Gompertz β values derived from the literature. Here: $p\beta_1 = 9.91$, $p\beta_2 = 37.93$
$\boldsymbol{\alpha_{1\text{-}2}}$	Parameter. Gompertz mortality model baseline mortality for females [1] and males [2].
$\boldsymbol{\beta_{1\text{-}2}}$	Parameter. Gompertz mortality model ageing for females [1] and males [2].
$\boldsymbol{\tau_j}$	Parameter. True age of sample *j*
$\boldsymbol{r_p}$	Parameter. Population growth of population *p*.
$\boldsymbol{s_d}$	Parameter. Sampling bias towards samples in window $W_{d.}$

Testing the model

We performed two analyses to test the ability of the model to estimate cetacean age-specific mortality. First, we test the ability of the model to recover the known input parameters. To do this we generate 100 simulated datasets of each combination of seven sample sizes (n = 10, 20, 35, 50, 75, 100, 200) and seven population growth rates (r =-0.25, -0.1, -0.05, 0, 0.05, 0.1, 0.25), giving a total of 4900 simulated datasets. Rather than selecting mortality parameters α and β at random, we chose the parameters to represent a plausible range of Odontocete adult lifespans. For each five-year age window between 0 and 50, we generated 500 paired α and β parameters resulting in lifespans within that window by selecting at random from a systematic analysis of the αxβ parameter space. For each simulation, we selected α and β parameters from these 7500 pairs. The result of this is an equal probability of the population in any simulation having an (adult) lifespan in any 5-year age window between 0 and 50. All other model parameters are chosen at random for each simulation. We apply the mortality model to each simulation and generate a posterior distribution of ordinary maximum lifespans (see calculating lifespans section) predicted by the model. Models that did not converge were not included in any further analysis. As our metric of model accuracy, we use the minimum credible interval width from the posterior distribution of maximum lifespans required to capture the true maximum lifespan. An accuracy of 0 would indicate the median of the posterior matches the true maximum lifespan, while an accuracy of 0.52 would mean that the true lifespan is captured by the 52% credible interval of the posterior. We focus on the accuracy of the model in relation to sample size, population growth and whale lifespan as those most likely to systematically bias our measures of lifespan with real data.

Secondly, we compare the lifespan estimates from our mortality model to well-characterised lifespan estimates derived from longitudinal data in a well-studied toothed whale population. Southern-resident killer whales inhabiting the north-east Pacific ocean are regularly observed in inland waters in the Salish Sea (Bigg et al. 1990). The population has been studied intensively for 50 years, and all births (of whales surviving their first year) and deaths in the population have been collated by the Center for Whale Research since 1976 (details, including age estimate for whales born before 1976, in: (Nielsen et al. 2021)). A previous study has used these detailed demographic records in conjunction with established Bayesian mark-recapture mortality modelling to estimate age-specific mortality in this population (Nielsen et al. 2021). Mark-recapture mortality models derive parameters for a mortality function given known dates of birth and death, incorporating sightings data to improve parameter estimation and estimate unknown years of birth (further details in: (Colchero et al. 2012; Nielsen et al. 2021)). We rescale the published age-specific survival estimates to apply only to adults by dividing all post-maturity survival estimates by the estimated survival to maturity. From these adult survival curves, we can derive a credible interval of ordinary maximum lifespans (hereafter: longitudinal lifespan). We tested our model by comparing the longitudinal lifespans to estimates derived from our model applied to data from the same population. We use a single year of southern-resident killer whale demographic data – the equivalent of a situation where the whole population of whales in a single year were sampled, sexed and aged – as the datasets input into the model. We use the year 1992 when the southern-residents population size peaked (1976-2015), the samples consist of 45 adult females and 16 adult males present in the population in that year.

Literature search

We performed a systematic and opportunistic search of the literature in May-September 2021 to identify and extract all published age-structured toothed whale data. Age-structured data are data where the ages of individuals of known age and sex can be collected or inferred from published results. For each of the 75 species of toothed whale (IWC 2021) we searched the Web of Science database (webofscience.com) with the species name plus separately each of “life history”, “lifespan” and “age structure”. We repeated this sequence with both the currently accepted species name, any

previously used species names, and all widely used common names for the species. In addition, limiting searches to publications in English can bias datasets in systematic reviews and meta-analyses (Konno et al. 2020). For each species, we, therefore, repeated the database query replacing the English search terms with the same terms translated into major languages commonly spoken around the species distribution. However, there is still likely to be some bias, especially against languages not written in the Latin alphabet. We also performed an opportunistic search by consulting the relevant chapters in the Handbook of Marine Mammals v4-7 (Ridgway and Harrison 1989, 1994, 1999) and the Encyclopaedia of Marine Mammals 3rd Edition (Würsig et al. 2018) and identifying potential data sources referenced in these chapters, as well as searching backwards and forwards through the citation network of identified papers.

We extracted age-structured datasets from these publications to create a database of odontocete age-structured data. Where possible each dataset in the database represents data from a single population collected at a single time, however in some systems and publications this is not possible and a single dataset represents data from multiple populations or is collected over a longer timescale. Each dataset represents only whales of a single known sex, and whales of unknown sex are not included in the datasets. In each publication, age data are extracted from the table or figure giving the largest and most complete sample. Where a single publication contains information from multiple populations we extracted data from each publication as a separate dataset, if possible. Where the same dataset is presented in multiple publications we use the original publication unless later publications present a larger sample. Data were extracted from figures using WebPlotDigitizer (Rohatgi 2020). Data were extracted and included in the database if they contained more than three adult samples of a given sex. For each species-sex, we define the age at maturity based on expert consensus (Ridgway and Harrison 1989, 1994, 1999; Würsig et al. 2018). The complete database contains 269 datasets from 118 publications with data from 44 species (table 2; figure 1; supplementary 1). The database has been built into an R package: marinelifehistdata (github.com/samellisq/marinelifehistdata).

We also parametrise the mortality model with dataset-specific information on population growth, sampling biases and age estimation error. We base our population change prior assumptions on the source of the data. Where datasets are derived from bycatch (usually resulting from largescale bycatch in commercial fisheries, such as the pacific gillnet fishery; N = 72) or whaling/drive fisheries (N = 50) we assume that the population is decreasing (pr = -1). Where datasets are from Harvest ('Aboriginal Subsistence Whaling' as defined by the International Whaling Commission; N = 20) we assume that there is no population change based on the monitoring and management the populations are subject to. For all other data sources, we assume that the population could be increasing or decreasing (pr = 0). Datasets are assumed to have no systematic sampling biases unless noted by the authors of the original study (or subsequent publications analysing the same dataset). Where biased sampling is present we define the bias window W using the information provided by the authors. Unless the ages in a dataset were derived from long-term observations (n = 8) or aspartic acid racemisation (n = 6) they were assumed to have additive age estimation error as defined by the model (above).

Calculating lifespan

We filtered the database before analysis. For each dataset, we calculate the number of samples, and the sampling rate (total samples/maximum observed age observed across all species-sex datasets). We only analyse species-sexes where at least one dataset has >10 samples and a sampling rate of >0.5.

We applied the mortality model to each species as described above. We obtain estimates of lifespan for each species-sex using Gompertz α and β parameters. Specifically, we calculate the age at which X proportion of species-sex life years have been lived via:

Equation 13

$$ageX = \min_{x \in [0:150]} (\{l(x) \leq (1 - X)\})$$

Here we use X=0.9 as ‘ordinary maximum lifespan’ (or age Z) as our measure of species-sex lifespan (Ronget and Gaillard 2020).

We calculate ordinary maximum lifespan from each of the 40 000 posterior draws of the fitted Bayesian model, resulting in a distribution of age Z’s for each species-sex.

Table 2. Details of the age-structured samples used in this study. Note while all datasets and species where data were identified are included here we only analyse species-sex in further analysis if it exceeded sample size and intensity conditions (see methods: calculating lifespan).

Common name	Species name	Sex	N Datasets	N Whales	Ref.
Atlantic spotted dolphin	*Stenella frontalis*	F	1	3	(Siciliano et al. 2007)
Atlantic spotted dolphin	*Stenella frontalis*	M	1	1	(Siciliano et al. 2007)
Atlantic white-sided dolphin	*Lagenorhynchus acutus*	F	4	45	(Sergeant et al. 1980; Addink et al. 1997; Rogan et al. 1997; Tuerk et al. 2005)
Atlantic white-sided dolphin	*Lagenorhynchus acutus*	M	4	32	(Sergeant et al. 1980; Addink et al. 1997; Rogan et al. 1997; Tuerk et al. 2005)
Baiji	*Lipotes vexillifer*	F	1	17	(Gao and Zhou 1992)
Baiji	*Lipotes vexillifer*	M	1	11	(Gao and Zhou 1992)
Baird's beaked whale	*Berardius bairdii*	F	2	24	(Balcomb 1989; Kasuya et al. 1997a)
Baird's beaked whale	*Berardius bairdii*	M	3	84	(Balcomb 1989; Kasuya et al. 1997a; Urbán et al. 2007)
Beluga whale	*Delphinapterus leucas*	F	8	757	(Lensink 1961; Burns and Seaman 1986; Heide-Jørgensen and Lockyer 2001; Stewart et al. 2006; Suydam 2009; Ferguson et al. 2020; Vos et al. 2020)
Beluga whale	*Delphinapterus leucas*	M	5	321	(Lensink 1961; Burns and Seaman 1986; Heide-Jørgensen and Lockyer 2001; Suydam 2009; Vos et al. 2020)
Chilean dolphin	*Cephalorhynchus eutropia*	F	1	9	(Molina and Reyes 1996)
Chilean dolphin	*Cephalorhynchus eutropia*	M	1	5	(Molina and Reyes 1996)
Commerson's dolphin	*Cephalorhynchus commersonii*	F	2	24	(Collet and Robineau 1988; Cáceres-Saez et al. 2015)
Commerson's dolphin	*Cephalorhynchus commersonii*	M	2	38	(Collet and Robineau 1988; Cáceres-Saez et al. 2015)
Common bottlenose dolphin	*Tursiops truncatus*	F	10	423	(Read et al. 1993; Kasuya et al. 1997b; Stolen and Barlow 2003; Mattson et al. 2006; Butti et al. 2007; Siciliano et al. 2007; Neuenhoff 2013; Gol'din and Gladilina 2015; Venuto et al. 2020)
Common bottlenose dolphin	*Tursiops truncatus*	M	10	307	(Read et al. 1993; Kasuya et al. 1997b; Stolen and Barlow 2003; Mattson et al. 2006; Butti et al. 2007; Siciliano et al. 2007; Neuenhoff 2013; Gol'din and Gladilina 2015; Venuto et al. 2020)
Common dolphin	*Delphinus delphis*	F	6	628	(Perrin and Myrick 1980; Van Utrecht 1981; Ferrero and Walker 1995; Danil and Chivers 2007; Viricel et al. 2008; Murphy et al. 2009)
Common dolphin	*Delphinus delphis*	M	3	44	(Van Utrecht 1981; Ferrero and Walker 1995; Durante et al. 2016)
Cuvier's beaked whale	*Ziphius cavirostris*	F	1	8	(Perrin and Myrick 1980)
Cuvier's beaked whale	*Ziphius cavirostris*	M	1	10	(Perrin and Myrick 1980)
Dall's porpoise	*Phocoenoides dalli*	F	4	854	(Kasuya 1978; Newby 1982; Kasuya and Shiraga 1985; Ferrero and Walker 1999)
Dall's porpoise	*Phocoenoides dalli*	M	4	456	(Kasuya 1978; Newby 1982; Kasuya and Shiraga 1985; Ferrero and Walker 1999)
Dusky dolphin	*Lagenorhynchus obscurus*	M	1	6	(Cipriano 1992)
Dwarf sperm whale	*Kogia sima*	F	1	15	(Plön 2004)
Dwarf sperm whale	*Kogia sima*	M	1	19	(Plön 2004)
False killer whale	*Pseudorca crassidens*	F	2	100	(Kasuya 1986; Ferreira et al. 2014)
False killer whale	*Pseudorca crassidens*	M	2	42	(Kasuya 1986; Ferreira et al. 2014)
Franciscana	*Pontoporia blainvillei*	F	7	228	(Kasuya and Brownell 1979; Barreto and Rosas 2006; Botta et al. 2010; Negri et al. 2016; Denuncio et al. 2018; Conversani et al. 2021)
Franciscana	*Pontoporia blainvillei*	M	7	262	(Kasuya and Brownell 1979; Barreto and Rosas 2006; Botta et

					al. 2010; Negri et al. 2016; Denuncio et al. 2018; Conversani et al. 2021)
Fraser's dolphin	*Lagenodelphis hosei*	F	3	39	(Van Bree et al. 1986; Amano et al. 1996; Siciliano et al. 2007)
Fraser's dolphin	*Lagenodelphis hosei*	M	4	41	(Van Bree et al. 1986; Amano et al. 1996; Siciliano et al. 2007; Durante et al. 2016)
Ganges river dolphin	*Platanista gangetica*	M	1	3	(Kasuya 1972)
Guiana dolphin	*Sotalia guianensis*	F	6	49	(Van Utrecht 1981; Rosas et al. 2003; Santos et al. 2003; Lima et al. 2016; Conversani et al. 2021)
Guiana dolphin	*Sotalia guianensis*	M	6	62	(Van Utrecht 1981; Rosas et al. 2003; Santos et al. 2003; Lima et al. 2016; Conversani et al. 2021)
Harbour porpoise	*Phocoena phocoena*	F	12	643	(Read and Tolley 1997; Lockyer et al. 2001; Gol'din 2004; Learmonth et al. 2014; Kesselring et al. 2018; Murphy et al. 2020)
Harbour porpoise	*Phocoena phocoena*	M	10	355	(Read and Tolley 1997; Lockyer et al. 2001; Gol'din 2004; Learmonth et al. 2014; Murphy et al. 2020)
Hector's dolphin	*Cephalorhynchus hectori*	F	1	7	(Slooten 1991)
Hector's dolphin	*Cephalorhynchus hectori*	M	1	9	(Slooten 1991)
Indian ocean humpback dolphin	*Sousa plumbea*	F	1	8	(Nolte 2014)
Indian ocean humpback dolphin	*Sousa plumbea*	M	1	21	(Nolte 2014)
Indo-pacific bottlenose dolphin	*Tursiops aduncus*	F	2	75	(Cockcroft and Ross 1990; Kemper et al. 2019)
Indo-pacific bottlenose dolphin	*Tursiops aduncus*	M	2	59	(Cockcroft and Ross 1990; Kemper et al. 2014)
Indo-pacific finless porpoise	*Neophocaena phocaenoides*	F	1	11	(Jefferson et al. 2002)
Indo-pacific finless porpoise	*Neophocaena phocaenoides*	M	1	8	(Jefferson et al. 2002)
Indo-pacific humpback dolphin	*Sousa chinensis*	F	2	20	(Jefferson et al. 2012; Guo et al. 2020)
Indo-pacific humpback dolphin	*Sousa chinensis*	M	2	22	(Jefferson et al. 2012; Guo et al. 2020)
Killer whale	*Orcinus orca*	F	6	112	(Christensen 1984; Herman et al. 2008; Best et al. 2010; Amano et al. 2011; Ellis et al. 2017)
Killer whale	*Orcinus orca*	M	5	75	(Christensen 1984; Herman et al. 2008; Best et al. 2010; Ellis et al. 2017)
Long-finned pilot whale	*Globicephala melas*	F	3	1170	(Martin et al. 1987; Bloch et al. 1993; Betty 2019)
Long-finned pilot whale	*Globicephala melas*	M	3	460	(Martin et al. 1987; Bloch et al. 1993; Betty 2019)
Melon-headed whale	*Peponocephala electra*	F	4	90	(Miyazaki et al. 1998; Amano et al. 2014; Kurihara et al. 2016)
Melon-headed whale	*Peponocephala electra*	M	4	52	(Miyazaki et al. 1998; Amano et al. 2014; Kurihara et al. 2016)
Narrow-ridged finless porpoise	*Neophocaena asiaeorientalis*	F	6	96	(Gao and Zhou 1993; Shirakihara et al. 1993; Kasuya 1999; Mei et al. 2012; Lee et al. 2013)
Narrow-ridged finless porpoise	*Neophocaena asiaeorientalis*	M	6	104	(Gao and Zhou 1993; Shirakihara et al. 1993; Kasuya 1999; Mei et al. 2012; Lee et al. 2013)
Narwhal	*Monodon monoceros*	F	3	100	(Garde et al. 2015; Watt et al. 2020)
Narwhal	*Monodon monoceros*	M	3	85	(Hay 1984; Garde et al. 2015)
Northern bottlenose whale	*Hyperoodon ampullatus*	F	1	26	(Christensen 1973)
Northern bottlenose whale	*Hyperoodon ampullatus*	M	1	52	(Christensen 1973)
Northern right whale dolphin	*Lissodelphis borealis*	F	2	105	(Ferrero and Walker 1993; Iwasaki and Kasuya 1997)
Northern right whale dolphin	*Lissodelphis borealis*	M	2	50	(Ferrero and Walker 1993; Iwasaki and Kasuya 1997)
Pacific white-sided dolphin	*Lagenorhynchus obliquidens*	F	3	73	(Walker et al. 1984; Ferrero and Walker 1996; Iwasaki and Kasuya 1997)
Pacific white-sided dolphin	*Lagenorhynchus obliquidens*	M	3	65	(Walker et al. 1984; Ferrero and Walker 1996; Iwasaki and Kasuya 1997)
Pantropical spotted dolphin	*Stenella attenuata*	F	8	1039	(Barlow and Hohn 1984; Kasuya 1985)

Pantropical spotted dolphin	*Stenella attenuata*	M	2	499	(Barlow and Hohn 1984; Kasuya 1985)
Peale's dolphin	*Lagenorhynchus australis*	F	1	3	(Boy et al. 2011)
Peale's dolphin	*Lagenorhynchus australis*	M	1	1	(Boy et al. 2011)
Pygmy sperm whale	*Kogia breviceps*	F	3	26	(Van Utrecht 1981; Plön 2004)
Pygmy sperm whale	*Kogia breviceps*	M	2	18	(Van Utrecht 1981; Plön 2004)
Risso's dolphin	*Grampus griseus*	F	4	51	(Amano and Miyazaki 2004; Bloch et al. 2012; Evacitas et al. 2017; Plön et al. 2020)
Risso's dolphin	*Grampus griseus*	M	4	17	(Amano and Miyazaki 2004; Bloch et al. 2012; Evacitas et al. 2017; Plön et al. 2020)
Rough-toothed dolphin	*Steno bredanensis*	F	2	10	(Miyazaki 1978; Siciliano et al. 2007)
Rough-toothed dolphin	*Steno bredanensis*	M	2	27	(Miyazaki 1978; Siciliano et al. 2007)
Short-finned pilot whale	*Globicephala macrorhynchus*	F	3	505	(Perrin and Myrick 1980; Kasuya and Marsh 1984; Kasuya and Tai 1993)
Short-finned pilot whale	*Globicephala macrorhynchus*	M	3	171	(Perrin and Myrick 1980; Kasuya and Marsh 1984; Kasuya and Tai 1993)
Sperm whale	*Physeter macrocephalus*	F	5	2932	(Ohsumi 1966; Best et al. 1984; Rice et al. 1986; Evans and Hindell 2004; Clarke et al. 2013)
Sperm whale	*Physeter macrocephalus*	M	5	2451	(Ohsumi 1966; Mitchell and Kozicki 1984; Rice et al. 1986; Kasuya 1991)
Spinner dolphin	*Stenella longirostris*	F	2	1420	(Larese and Chivers 2009)
Spinner dolphin	*Stenella longirostris*	M	2	158	(Perrin et al. 1977; Perrin and Henderson 1984)
Stejneger's beaked whale	*Mesoplodon stejnegeri*	M	1	6	(Arai et al. 2004)
Striped dolphin	*Stenella coeruleoalba*	F	2	913	(Miyazaki 1984; Marsili et al. 1997)
Striped dolphin	*Stenella coeruleoalba*	M	2	680	(Miyazaki 1984; Marsili et al. 1997)
Vaquita	*Phocoena sinus*	F	1	11	(Hohn et al. 1996)
Vaquita	*Phocoena sinus*	M	1	10	(Hohn et al. 1996)
White-beaked dolphin	*Lagenorhynchus albirostris*	F	3	51	(Van Utrecht 1981; Dong et al. 1996; Galatius et al. 2013)
White-beaked dolphin	*Lagenorhynchus albirostris*	M	3	29	(Van Utrecht 1981; Dong et al. 1996; Galatius et al. 2013)

Results

Testing the model

Our first set of analyses explore the consistency and accuracy of the model across a realistic range of population growth rates and whale adult lifespans (figure 2). There is a trend for increased accuracy with larger sample sizes: with larger sample sizes the posterior median is closer to the true lifespan (figure 2). However, the increase in accuracy is relatively modest and quite variable, for example in stable populations (r = 0) mean minimal credible interval required to capture the true lifespan is 60± 35% (±std. dev.) for a sample size of 10 and 27± 37% for a sample size of 200 (figure 2). There are no clear trends for increased accuracy for either shorter lifespans or more stable populations (figure 2). The model accuracy is maintained across these scenarios because credible intervals are wider under small sample sizes and for long-lived whales: in short, the model becomes less certain under more unsure information. Under all scenarios, the largest mean minimum credible interval needed to capture the true value is 77% (n=10, true age 40-49) suggesting that as long as measures of error are carried through subsequent analyses the model is likely to capture the true lifespan.

In our second analysis, we compare the mortality estimates from our model to those derived from longitudinal data when applied to the southern-resident killer whales. The longitudinally-derived adult lifespan of female and male southern-resident killer whales is, respectively, 69 (62-79) years [mean (95 % cred. int.)] and 44 (40 -51) years (derived from: (Nielsen et al. 2021). Our model applied to the southern-resident killer whale population in 1992 estimates lifespans of: 76 (65-88) for females and 44 (38-53) for males. For both males and females there is considerable credible interval overlap between estimates derived from the two models.

Toothed Whale lifespans

Applying our mortality model to the real Odontocete age-structured data allowed us to generate lifespan estimates for 32 female and 33 male toothed whale species (table 3; table 4; figure 1; figure 3). The estimates for each species-sex were based on a median of 75 whales (1st quartile = 39; 3rd quartile = 355). The phylogenetic spread of samples is broad with all of the major Odontocete clades represented (figure 1).

Male Baird's beaked whales have the longest lifespan in our sample, with an ordinary maximum lifespan of 84-90 years (50% credible interval [50CI]). The longest-lived females in our sample are Narwhals with an ordinary maximum lifespan of 74-80 years (50CI). The shortest-lived species in our sample are female Dall's Porpoises and Franciscana of both sexes all of which have a median ordinary maximum lifespan of 13 years.

There is good evidence in 10 species that females have a longer adult lifespan than males (proportion of posterior where female – male lifespan is greater than 0 > 0.97; figure 4). However, in 4 species – Baird's beaked whales, Commerson's dolphin, northern bottlenose whales and sperm whales - the opposite is true and there is clear evidence that males live longer as adults than females (proportion of posterior female – male lifespan is less than 0 >0.975; figure 4). In the remaining species, there is no clear evidence that the sexes have different lifespans. Combining all species female toothed whales live a median of 10% longer than males (female – male lifespan / female lifespan), but overall there is no clear evidence of a sex difference in lifespan (proportion of posterior female – male lifespan > 0 = 0.66).

Table 3. Estimated female ordinary maximum lifespan for 32 species of toothed whale. Where ordinary maximum lifespan is the age at which 90% of adult life years have been lived. All metrics describe the distribution of the posterior derived from the Bayesian mortality model (see methods). Each metric (apart from standard deviation) is the adult lifespan estimated by the model plus the age at maturity to give the expected maximum lifespan for females who reach maturity (Age at Maturity). lCI, and uCI represent the lower and upper bounds respectively of the 50% (l/uCI50) and 95% (l/uCI95) credible intervals.

Common name	Age at Maturity	Median	lCI50	uCI50	lCI95	uCI95	Post. Mean	Post. sd
Atlantic white-sided dolphin	9	21	20	21	19	23	20.88	0.97
Baiji	6	22.5	21	24	20	27	22.71	1.85
Baird's beaked whale	13	52	50	55	46	62	52.76	4.09
Beluga whale	10	54	53	55	52	56	53.85	1.15
Commerson's dolphin	5	17	17	18	15	20	17.48	1.32
Common bottlenose dolphin	9	40	39	40	38	41	39.76	0.82
Common dolphin	7	25	25	25	24	26	25.04	0.42
Dall's porpoise	5	13	13	13	12	13	12.88	0.32
Dwarf sperm whale	4	20	19	22	17	25	20.53	1.92
False killer whale	10	67	66	69	62	74	67.51	2.84
Franciscana	2	13	13	13	12	14	13.14	0.55
Fraser's dolphin	6	20	20	21	18	23	20.38	1.22
Guiana dolphin	6	33	32	35	30	38	33.45	2.09
Harbour porpoise	3	17	17	18	17	18	17.3	0.5
Indo-pacific bottlenose dolphin	12	37	36	38	34	41	36.92	1.85
Indo-pacific humpback dolphin	9	38	36	40	34	45	38.55	3
Killer whale	13	60	58	62	54	66	59.81	3.31
Long-finned pilot whale	8	45	45	46	44	46	45.17	0.68
Melon-headed whale	7	41	40	42	38	45	41.35	1.83
Narrow-ridged finless porpoise	5	23	23	24	21	25	23.24	1.11
Narwhal	8	77	74	80	69	86	76.81	4.4
Northern bottlenose whale	10	27	26	28	24	31	26.92	1.69
Northern right whale dolphin	9	28	28	29	26	31	28.5	1.15
Pacific white-sided dolphin	9	40	39	42	37	45	40.5	1.98
Pantropical spotted dolphin	10	35	35	35	34	36	35.09	0.47
Pygmy sperm whale	5	22	21	24	20	26	22.58	1.73
Risso's dolphin	9	34	32	35	31	38	33.74	1.82
Short-finned pilot whale	9	56	55	57	54	58	55.81	1.14
Sperm whale	9	49	48	49	48	50	48.7	0.61
Spinner dolphin	8	23	23	23	23	24	23.07	0.26
Striped dolphin	9	31	31	31	30	32	31.11	0.51
Vaquita	5	23	22	24	20	28	23.16	2.24
White-beaked dolphin	8	36	34	37	32	40	35.74	2.03

Table 4. Estimated male ordinary maximum lifespan for 33 species of toothed whale. Where ordinary maximum lifespan is the age at which 90% of adult life years have been lived. All metrics describe the distribution of the posterior derived from the Bayesian mortality model (see methods). Each metric (apart from standard deviation) is the adult lifespan estimated by the model plus the age at maturity to give the expected maximum lifespan for males who reach maturity (Age at Maturity). lCI, and uCI represent the lower and upper bounds respectively of the 50% (l/uCI50) and 95% (l/uCI95) credible intervals.

Common name	Age at Maturity	Median	lCI50	uCI50	lCI95	uCI95	Post. Mean	Post. sd
Atlantic white-sided dolphin	9	22	21	23	20	25	22.21	1.2
Baiji	6	20	19	22	18	25	20.48	1.93
Baird's beaked whale	13	87	84	90	78	97	87.31	4.91
Beluga whale	10	49	48	50	46	52	48.72	1.67
Commerson's dolphin	5	22	21	23	19	25	21.78	1.39
Common bottlenose dolphin	9	37	36	38	35	39	36.89	0.99
Common dolphin	7	25	24	26	23	28	25.32	1.46
Dall's porpoise	5	14	14	14	13	14	13.96	0.26
Dwarf sperm whale	4	20	19	21	17	24	20.12	1.75
False killer whale	10	55	53	58	49	63	55.54	3.52
Franciscana	2	13	12	13	12	13	12.55	0.55
Fraser's dolphin	6	19	18	19	17	21	18.62	1.06
Guiana dolphin	6	28	27	29	25	31	27.64	1.61
Harbour porpoise	3	16	16	17	15	17	16.28	0.51
Indian ocean humpback dolphin	10	26	25	27	23	30	25.99	1.65
Indo-pacific bottlenose dolphin	12	36	35	37	33	39	35.83	1.73
Indo-pacific humpback dolphin	9	29	27	30	25	33	28.75	1.96
Killer whale	13	38	37	39	35	42	38.13	1.73
Long-finned pilot whale	8	35	35	36	34	37	35.45	0.84
Melon-headed whale	7	35	34	37	32	40	35.57	1.97
Narrow-ridged finless porpoise	5	23	22	23	21	25	22.64	0.99
Narwhal	8	66	63	69	58	75	66.27	4.28
Northern bottlenose whale	10	36	35	37	32	40	35.89	1.93
Northern right whale dolphin	9	24	23	25	22	26	23.93	1.2
Pacific white-sided dolphin	9	38	37	39	34	42	37.88	1.92
Pantropical spotted dolphin	10	32	31	32	31	33	31.76	0.58
Rough-toothed dolphin	10	30	29	32	27	35	30.63	1.91
Short-finned pilot whale	9	37	36	38	34	39	36.64	1.31
Sperm whale	9	53	52	53	51	54	52.5	0.63
Spinner dolphin	8	19	19	20	18	20	19.3	0.56
Striped dolphin	9	30	30	31	29	31	30.12	0.68
Vaquita	5	21	20	23	18	27	21.63	2.32
White-beaked dolphin	8	29	28	31	26	34	29.52	2.08

Figure 1 Toothed whale phylogeny (adapted from (McGowen et al. 2020)). Data are available to apply our model and estimate age-specific mortality for at least one sex in 35 species (black text). Branch colours correspond to taxonomic family.

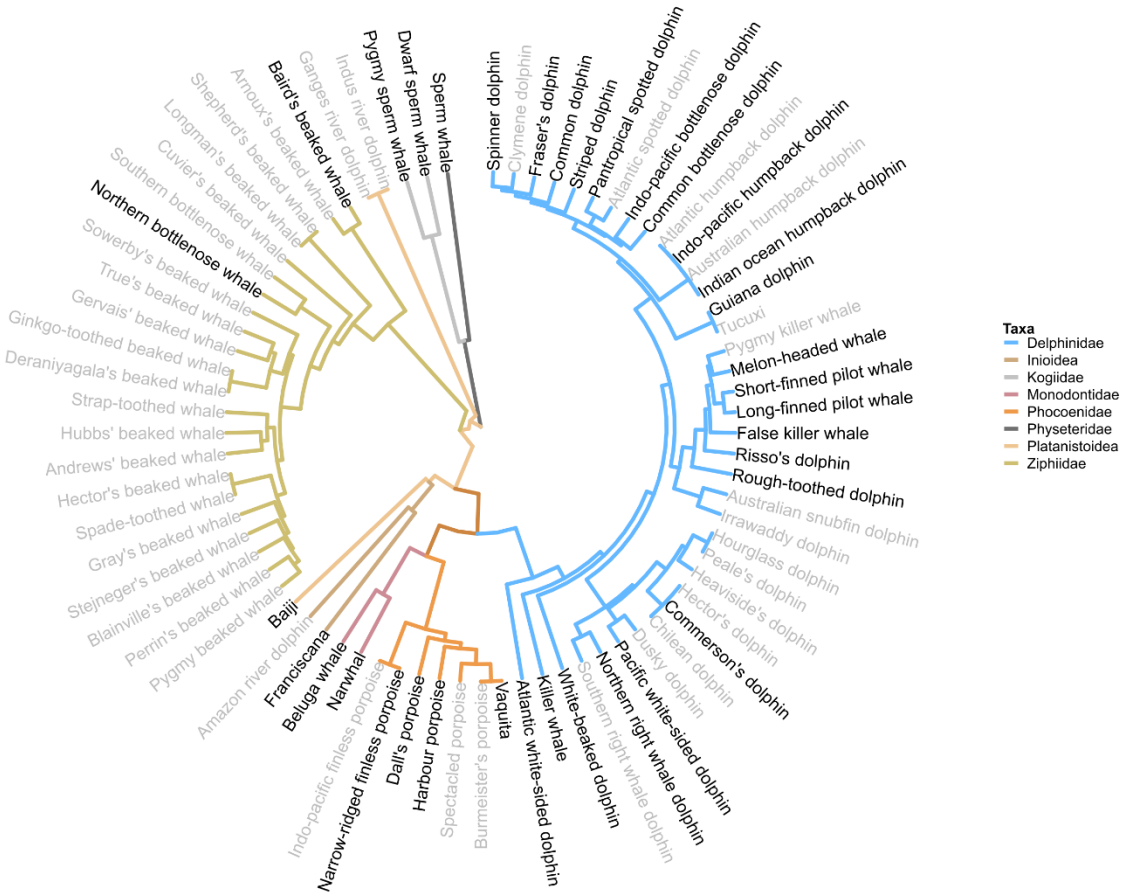
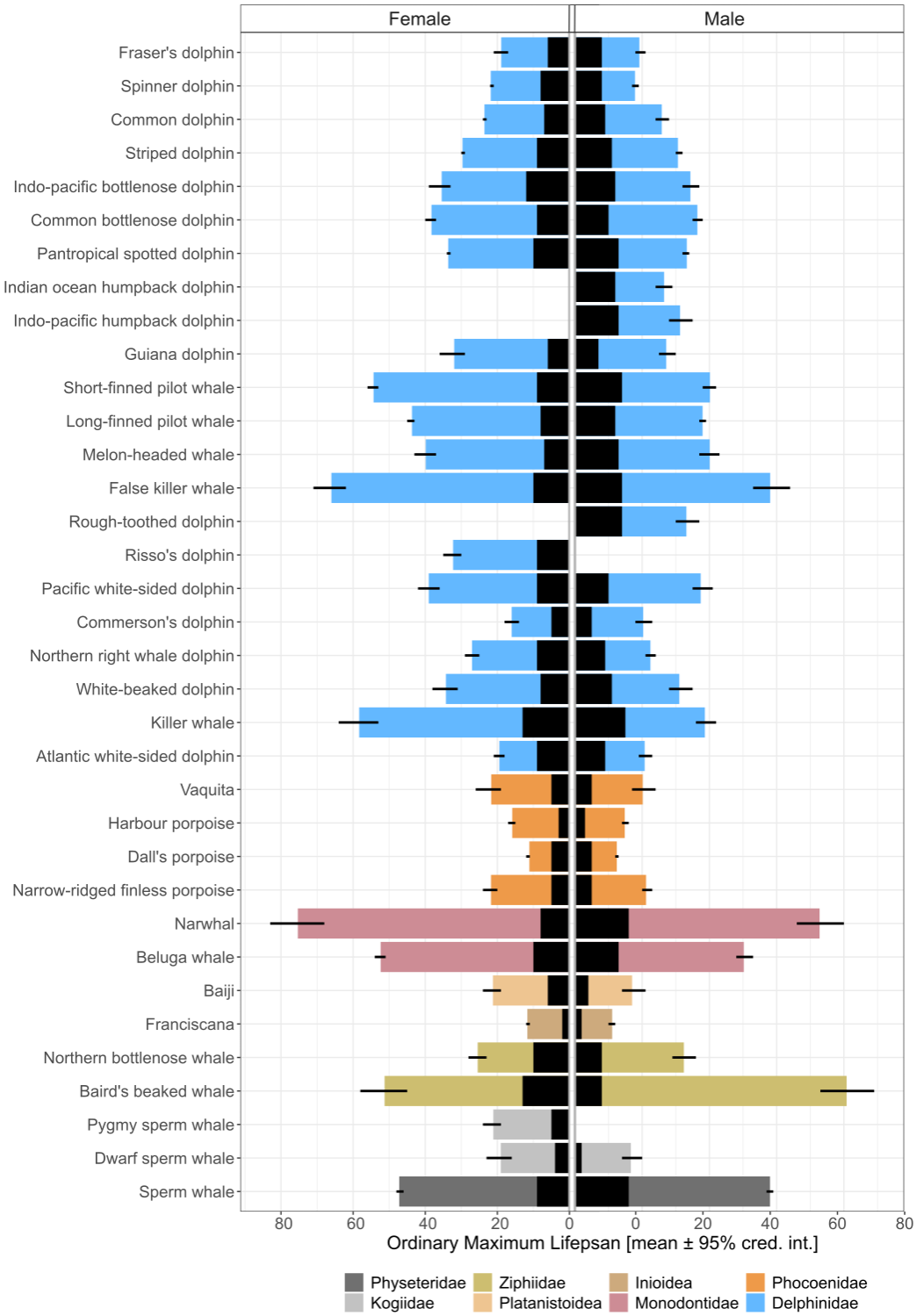


Figure 2. Results from simulations testing the accuracy of the mortality model to detect the true maximum lifespan of a population under a range of A) sample sizes (n) x population growth rates (r) and B) sample sizes x true maximum lifespans. Each cell shows the mean ± std dev. of accuracy over models in each scenario. Cell colour shows the mean accuracy, with darker colours and smaller values indicating greater accuracy. Accuracy is measured as the minimum credible interval width from the posterior distribution of maximum lifespans required to capture the true maximum lifespan. An accuracy of 0 individuates the median of the posterior matches the true maximum lifespan, while an accuracy of 0.5 means that the true lifespan is captured by the 50% credible interval of the posterior. 100 models were run for each population growth x sample size scenario, resulting in a total of 4900 fitted models. B) is based on the same 4900 fitted models, true maximum lifespans and has a uniform probability of being selected but the number of models applied in each cell will vary. Note that neither sample size nor population growth rate are a regular sequence.

Figure 3. Lifespans of female (left panel) and male (right panel) toothed whales estimated by our mortality model. Bars show a mean estimate of the ordinary maximum lifespan - the age by which 90% of adult life years have been lived - derived from our mortality model. Error bars show the 95% credible interval of lifespan estimates. Black areas show the juvenile years not estimated by our model. Ordinary maximum lifespan, therefore, represents lifespan given survival to maturity. Species order and bar colours reflect phylogeny. For some species data were available for only one sex - resulting in an empty bar.



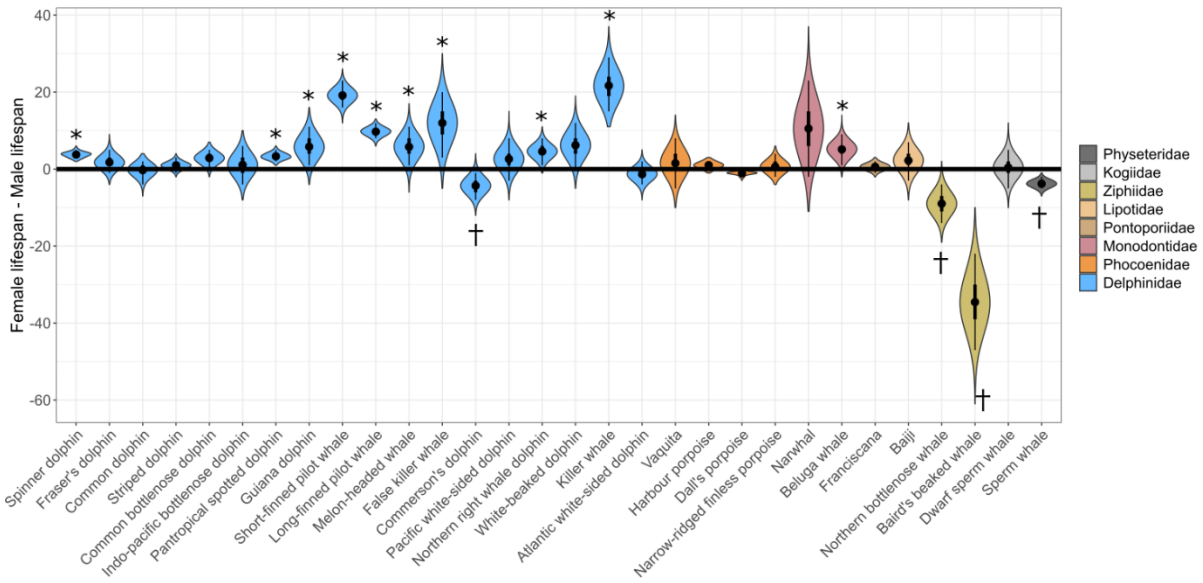


Figure 4. Comparing female and male lifespan in toothed whales. Violins show the posterior distribution of female–male lifespan derived from our mortality models. Both sexes are assessed in the same model so the posterior lifespan of each sex at each draw can be directly compared. * indicate species where there is good evidence that females live longer than males (proportion of posterior greater than 0 >0.975). † indicate species where there is good evidence that males live longer than females (proportion of posterior less than 0 >0.975). Violin colour represent phylogeny.

Discussion

Here we have developed and applied a method to estimate lifespan parameters from age-structured cross-sectional samples. Simulations demonstrate that the models can capture true lifespan given population growth, sampling error and age-estimation error under a realistic range of sample sizes and species maximum lifespans. Applying the model to data collected from the literature provides lifespan estimates for 32 female and 33 male species of toothed whale.

We find that there is almost an order of magnitude difference between the ordinary maximum lifespan of the shortest-lived and longest-lived toothed whales. This variation is particularly remarkable given that many other aspects of toothed whale life history do not differ between species. For example, all toothed whales: give birth to a single offspring per breeding event; provide several years of maternal year to their dependent offspring; and exhibit a polygynous mating system with no evidence of paternal care (Whitehead and Mann 2000; Chivers 2018). At the broadest level, toothed whale species also share a similar ecological niche, all are aquatic carnivores and most live and often hunt in social groupings. Despite these similarities here, we have shown that lifespan can vary considerably between species.

We found that in 10 species of toothed whale there is good evidence that females live longer as adults than males - and overall female toothed whales live 10% longer than males. Longer-lived females are the norm in mammals: for example, a recent analysis of 101 mammal species – including four toothed whales - found that female mammals live a mean of 18.6% longer than males (Lemaître et al. 2020). The evolutionary drivers of sex differences in adult lifespan in mammals remain unresolved but both genetic conflict and life-history trade-offs have been implicated (Lemaître et al. 2020). However, in toothed whales, we found that there are exceptions to this pattern. Perhaps most notably, in Baird's beaked whales' males live considerably longer than females: the median predicted ordinary maximum lifespan of females is 52 years compared to 87 for males. In Baird's beaked whales, this sex difference in lifespan leads to heavily male-biased adult populations but the evolutionary reasons for the extreme lifespan differences in this species remain unknown (Kasuya et al. 1997a). Overall there is considerable variability in the direction and size of sex differences in adult lifespan in this taxa making toothed whales an important taxonomic group in which to test theories investigating sex differences in lifespans.

This result of sex differences analysis highlights a strength of our modelling approach as rather than simply comparing the final realised maximum lifespans we can compare female and male lifespans at each posterior model draw. More generally, by taking a Bayesian approach we can embrace the uncertainty inherent in age-structured data and still draw useful inferences from uncertain data. The important implication of this is that this analysis aims to capture a distribution of plausible values of lifespan for toothed whale species- rather than to define a single 'best-guess' point estimate. Any future studies using these lifespan estimates should take this into account by carrying error through their analysis and not simply relying on a point-estimate of lifespan. It is also important to note that although throughout this study we have focussed on lifespan as our metric of species survival, our methods could also be used to derive distributions of other measures of age-specific mortality (e.g. measures of mortality shape (Healy et al. 2019)) which might be more relevant for answering some questions.

Our approach builds upon and generalises concepts and methods that have been used to estimate cetacean lifespans from age-structured data. Conceptually, our Bayesian approach – which uses priors from other species – has similarities to earlier methods based on scaling known 'model' lifetables from other species to toothed whales (Barlow and Boveng 1991; Caswell et al. 1998). Unlike previous Bayesian approaches to using age-structured data to estimate cetacean life history, we aim to capture the distribution of mortality parameters consistent with the data and the unknown effects of population growth and sampling bias, rather than explicitly estimating populating growth and

sampling bias parameters (Moore and Read 2008; Saavedra 2018; Rouby et al. 2021). As a consequence our approach can estimate usefully narrow distributions of life-history parameters based on relatively smaller sample sizes than previous methods, but – unlike those methods – is not suited in its current form to calculating growth rates or the demographic consequences of human-induced mortality in a given population.

It will be decades before longitudinal studies can provide the data necessary to provide estimates of life-history metrics by currently established methods for most toothed whale species. For many species, utilising age-structured data are the only way we will be able to begin to understand their life history for the foreseeable future. In this study, we utilised modern statistical methodology, and the power of modern computing, to derive age-specific mortality estimates for 44% of extant toothed whale species, representing an important step in understanding the evolution and diversity of Odontocete life history.

Data availability statement

The data underlying this article are avalaible in the *marinelifehistdata* R package at github.com/samellisq/marinelifehistdata.

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Supporting information

S1 Modelling pathway applied to toothed whale data.

Conflict of interest

The authors declare no conflict of interest.

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