# Supplementary Information about Expert Elicitation

February 10, 2023

# Preamble

This is an Electronic Supplement to the manuscript Marques et al. "Quantifying Deepwater Horizon oil spill induced injury on pelagic cetaceans" submitted to Marine Ecology Progress Series (MEPS).

There are 8 Electronic Supplements to the paper. The master file containing links to all the other 7 additional Electronic Supplements related to this paper is ESO\_ElectronicSupplements.

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#### Version history

This section details the version history for static pdf files submitted as Electronic Supplement pdfs:

- 1.0 [12 Aug 2022] Version included as a pdf Electronic Supplement in the MEPS original submission
- 2.0 [10 Feb 2023] Version included as a pdf Electronic Supplement in the MEPS re-submission after 1st round of reviewer's comments

# Background

Expert elicitation (EE) workshops were carried out to generate probabilistic distributions for parameters for which there were limited empirical information to update population models used in Deepwater Horizon (DWH) Natural Resources Damage Assessment (integrating the latest and best data sources)(DWH MMIQT, 2015). The elicitation was designed following the approach of Booth & Thomas (2021). Experts were chosen such that each individual had substantial knowledge on a given species group and/or the quantities of interest (see Table SI.1). The breadth of expertise in the workshops was coordinated so that a comprehensive coverage of opinions could be achieved. As such, experts with knowledge of a wide range of cetacean taxa, their ecology and spanning the fields of population biology, demography, epidemiology, animal physiology and veterinary science were selected (following guidance from Gosling 2018; Hart et al. 2018).

Expert elicitation is a taxing mental process, even for quantitative scientists, as it is challenging for experts to express their judgements in a manner that can used to derive a probability distribution. To help mitigate this, experts participated in a webinar before the EE workshops to be familiarized with the objectives, approaches and quantities of interest to be addressed in the EE. In addition experts were asked to complete a four-part online e-learning training course. This course can be found at:

- 1. https://eetraining.ursinus.edu/module 1 probabilities
- 2. https://eetraining.ursinus.edu/module 2 distributions
- 3. https://eetraining.ursinus.edu/module\_3\_judgements
- 4. https://eetraining.ursinus.edu/module\_4\_practice

Two EE workshops were conducted. The first, on 13th-14th January 2020 focussed on eliciting parameters related to the recovery of individuals exposed to oil. The second, on 15th-16th January 2020, focussed on eliciting parameters related to the population dynamics model, particularly density dependence. Separate groups of experts attended each workshop (Table S1.1). Some EE outputs were also used in the population model for Barataria Bay bottlenose dolphins by Schwacke et al. (2021); further details on these parameters are given in that paper.

In the lead-up to the EE workshops, each group of experts was provided with an evidence dossier and the workshops began with introductory presentations – which included information on the prevalence of abnormal prognoses across years for dolphins born prior to and following the DWH oil spill. During the workshops, the expert panels were supported by scientific "observers" who presented foundational briefings on the key information available to inform judgements on quantities of interest. Observers did not provide any judgements and only provided additional context when called upon. This process was facilitated by a trained workshop leader (Cormac Booth) to manage the discussions to ensure the final distributions were robustly derived.

Table 1: List of experts participating in the Expert Elicitation workshops held within CARMMHA

Expert name	Affiliation	EE workshop topic
Cynthia Smith	National Marine Mammal Foundation	Recovery
Michael Ziccardi	University of California, Davis	Recovery
Nicholas Keller	National Marine Fisheries Service	Recovery
Tracy Collier	Ocean Associates Inc.	Recovery
Andreas Fahlman	Global Diving Research	Recovery
Ailsa Hall	Sea Mammal Research Unit	Recovery
Barbara Taylor	National Marine Fisheries Service (NMFS)	Density dependent fecundity
Philip Dixon	Iowa State University	Density dependent fecundity
Randall Wells	Chicago Zoological Society	Density dependent fecundity
Tim Gerrodette	Ret. (NMFS)	Density dependent fecundity
Alex Zerbini	National Marine Fisheries Service (NMFS)	Density dependent fecundity
Mike Hammill	Department of Fisheries and Oceans (CA)	Density dependent fecundity

# Methods

Prior to eliciting personal judgements, experts were given a primer on the probability concepts of interest comprising plausible limits (broadly defined as the 1% and 99% quantiles), median and quartiles. The facilitator highlighted some of the key biases and/or heuristics that can affect the quality of expert judgements, to ensure experts were conscious of these when providing their personal judgements. The scope of the elicitation and questions were discussed and clarified with the experts and questions were iteratively developed to ensure linguistic uncertainty was removed.

Experts were asked to provide their judgements for each parameter using variable interval methods, first identifying their personal judgements for plausible range and then dividing this range with median and 25th and 75th quantiles. Experts used a web-based app written using the R package Shiny (Chang et al. 2021) (https://smruconsulting.shinyapps.io/EE\_SingleParam/) to anonymously and independently submit their judgements before they were fitted to a range of probability distributions in the R package SHELF (Gosling 2018) using minimum least squares. Once all experts' judgements were received they were presented back to the group and each expert was invited to outline and discuss their judgements as a group to reach a consensus of what would be a rational impartial view of the combined knowledge and discussions (see Astfalck et al. (2018)).

# Density dependent fecundity response

Experts were asked about the shape of the density dependent fecundity response  $\rho$  in bottlenose dolphins (see Schwacke et al. 2021 for additional details). This parameter affects the rate at which fecundity decreases as population size increases. The elicited distribution is shown below. Following that exercise, experts were asked the same question about sperm whales. Initially, some experts voiced concern about their expertise to provide a single distribution for all offshore species. The question was agreed as: "Given that the value of  $\rho$  will affect the shape of the density dependent response of fecundity in offshore cetacean populations, what do you judge to be the most appropriate value for  $\rho$  for this species and population?". They highlighted the range of prey, predators and wide-ranging environmental conditions as possible conflicting factors. They noted the strong social structure for sperm whales will keep fecundity high, closer to K, but that the resource environment was likely to be more variable. But despite differences in the environment, foraging strategies and reproductive biology, experts came to a similar consensus as for bottlenose dolphins – indicating for marine mammal species, some generalisation is possible. The resulting distribution for sperm whales is also shown below (Figure SI.1), and since the differences were so small, it was agreed upon as such the probability distribution for bottlenose dolphins could be applied to all other taxonomic units considered.

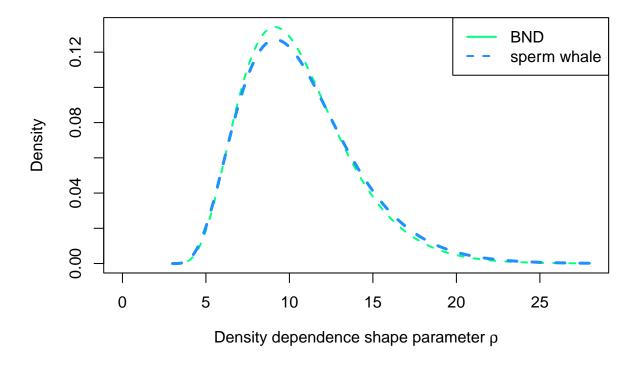


Figure S1.1 - Probability distributions showing the consensus of the EE for the value of density dependence shape parameter  $\rho$  for Gulf of Mexico offshore cetacean species.

## Effect of oiling on survival

Working with experts, we grouped taxonomic units according to the main factors that were considered likely to affect their survival after exposure to oil. Experts identified direct effects of oiling on the animals (e.g. respiratory, cardiovascular, endocrine effects) and indirect (e.g. effects on foraging ability and habitat/prey) as the primary drivers of reduced survival. Using this information the following species groupings were agreed, based around foraging ecology (Pelagic, Mesopelagic or Bathypelagic) and, relatedly, dive performance

(dictated by reduced respiratory and cardiovascular function) (Table S1.2).

Table 2: Table S1.2 – Species groups determined via the EE workshops within CARMMHA

Common Name/Species	Foraging Ecology
Shelf bottlenose dolphin	Pelagic
Atlantic spotted dolphin	Pelagic
Clymene dolphin	Pelagic
Fraser's dolphin	Pelagic
Pantropical spotted dolphin	Pelagic
Spinner dolphin	Pelagic
Striped dolphin	Pelagic
Offshore bottlenose dolphin	Mesopelagic
False killer whale	Mesopelagic
Melon-headed whale	Mesopelagic
Pygmy killer whale	Mesopelagic
Risso's dolphin	Mesopelagic
Rough-toothed dolphin	Mesopelagic
Short-finned pilot whale	Mesopelagic
Pygmy & dwarf sperm whale	Mesopelagic
Sperm whale	Bathypelagic
Beaked whales spp.	Bathypelagic

For each species group (Pelagic, Mesopelagic or Bathypelagic), a round of EE was conducted to generate a probabilistic distribution for the effects of DWH oiling on the species survival. The following question structure was used: "What is your personal judgement of the true value for the proportional change in survival rate multiplier for this species group exposed to DWH oil?". Experts agree to provide judgments on the basis that animals are exposed to the same degree as observed in Barataria Bay bottlenose dolphins.

For each group, the experts considered the possible mechanisms by which DWH oiling might affect the survival of each species group. Experts identified a series of direct and indirect mechanisms. The primary direct pathways were via respiratory effects (e.g pneumonia, pulmonary fibrosis potentially affecting dive performance and consequently foraging ability), endocrine issues (including, but not limited to, adrenal crisis, impaired stress response, energy balance and cholesterol dysregulation) and cardiac conditions (e.g. direct cardiotoxicity, anema, arrhythmia and pulmonary hypertension). In addition experts highlighted that gastrointestinal, neurological, developmental and other immune issues may be prevalent. The main indirect pathway was via effects on each species habitat and prey and experts considered the potential that animals might be displaced away from prime habitat in providing their judgements. Given the possible health consequences of exposure to DWH oiling and the likelihood that pulmonary and cardiac systems would be negatively affected, experts considered that cardiovascular systems of exposed animals of all groups would be impaired and dive performance (and so ability to effectively forage) could be impacted. As such the distributions for all groups indicate a reduction in survival as a consequence of DWH oiling, with increasing reduction in survival estimated for species reliant on deeper diving foraging strategies (Figure S1.2). It was considered that deep diving species would be exposed for the typically, relatively short period of time at the surface oil followed by closing alveoli before diving. Conversely, shallow divers were more likely to be frequently exposed to the surface oil for longer (with greater potential for impacts caused via aspiration of fresh oil). In addition, experts agreed that it was possible that larger cetaceans could be more severely affected by the same mass-specific dose of oil as a smaller animal due to metabolic scaling. Experts noted that oil exposure represents an additional stressor in already challenging offshore environment of the Gulf of Mexico. The broad range of the distribution represents the scientific uncertainty about the animals' exposure and lack of data on these species.

The following distributions were generated for each group (Figure SI.2).

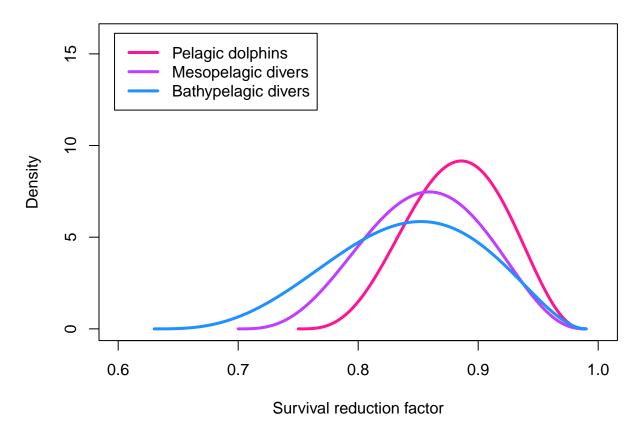


Figure S1.2 - Probability distributions showing the consensus of the EE for the proportional reduction in survival for each species group, as a consequence of exposure to DWH oil. Note this corresponds to a mean survival reduction of 0.88 (standard deviation 0.04), 0.86 (standard deviation 0.05) and 0.84 (standard deviation 0.06) for pelagic dolphins, mesopelagic divers and bathypelagic divers, respectively.

#### Proportional recovery following DWH oiling

To estimate the proportional recovery (in survival probability) of those affected by DWH oiling, experts agreed the wording of and provided judgments to the following question: "Think about an offshore Gulf of Mexico cetacean species whose health has been impacted by the DWH oil spill and has a guarded, poor or grave prognosis in the first year or two after the DWH spill. Going forward, in the animal's lifetime, what is the probability that it has a good or fair prognosis?"

Experts were briefed on the veterinary prognosis scores from health assessments for Bay, Sound and Estuary bottlenose dolphins in the Gulf of Mexico (see Schwacke et al. 2021) and asked to consider the mechanisms driving health prognosis for offshore cetacean species. Experts considered ill-effects of impacted pulmonary, cardiac and endocrine systems (e.g. pneumonia, pulmonary fibrosis, anemia, impaired stress response etc.) and the probability that such conditions were recoverable in an open-ocean environment. In general, experts considered that it was unlikely that most offshore cetacean species would recover (Figure S1.3) but that animals with a guarded prognosis might be more likely to recover. This resulted in a skewed distribution with some weight allowing for the greater likelihood that animals in the guarded category might recover. This tail was driven by the scientific uncertainty about the recoverability of some health conditions and therefore the likelihood of improved prognosis for animals in the 'guarded' category. There was also concern that the dynamic prey environment in the open ocean, coupled with the potential that the effects of oiling may compromise dive performance (and so foraging efficiency) could make recovery challenging for most animals.

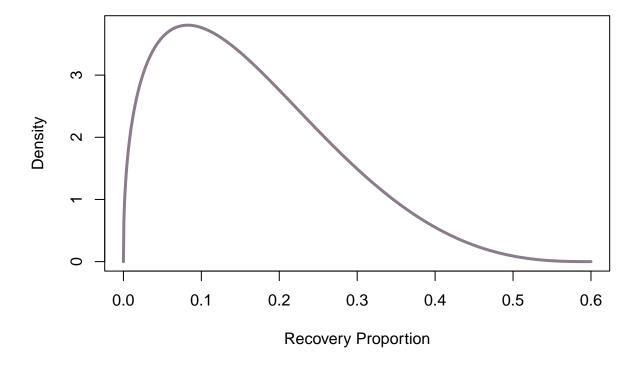


Figure S1.3 - Probability distribution showing the consensus of the EE for the proportional recovery of survival in Gulf of Mexico offshore cetacean species following DWH oiling.

The mean value of this distribution is 0.166, the corresponding median 0.148 and 0.025% and 0.975% quantiles of the distribution are (0.014, 0.411).

## References

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