

Lunge filter feeding biomechanics constrain rorqual foraging ecology across scale

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Summary Statement:

This article presents the relationship between rorqual body length and filter time as a biomechanical constraint and the implications to rorqual foraging performance and ecology as a result.

Abstract

Fundamental scaling relationships influence the physiology of vital rates, which in turn shape the ecology and evolution of organisms. For diving mammals, benefits conferred by large body size include reduced transport costs and enhanced breath-holding capacity, thereby increasing overall foraging efficiency. Rorqual whales feed by engulfing a large mass of prey-laden water at high speed and filtering it through baleen plates. However, as engulfment capacity increases with body length (Engulfment Volume \propto Body Length^{3.57}), the surface area of the baleen filter does not increase proportionally (Baleen Area \propto Body Length^{1.82}), and thus the filtration time of larger rorquals predictably increases as the baleen surface area must filter a disproportionately large amount of water. We predicted that filtration time should scale with body length to the power of 1.75 (Filter Time \propto Body Length^{1.75}). We tested this hypothesis on four rorqual species using multi-sensor tags with corresponding unoccupied aircraft systems (UAS) -based body length estimates. We found that filter time scales with body length to the power of 1.79 (95% CI: 1.61 - 1.97). This result highlights a scale-dependent trade-off between engulfment capacity and baleen area that creates a biomechanical constraint to foraging through increased filtration time. Consequently, larger whales must target high density prey patches commensurate to the gulp size to meet their increased energetic demands. If these optimal patches are absent, larger rorquals may experience reduced foraging efficiency compared to smaller whales if they do not match their engulfment capacity to the size of targeted prey aggregations.

Introduction

Body size influences the evolution of morphological traits and physiological performance (Alexander, 1998; Hespeneide, 1973; Schmidt-Nielsen, 1984). Regardless of taxa, large body size is generally thought to confer a wide range of physiological and ecological benefits (Calder, 1984; Peters, 1983; Slater et al., 2017). However, large body size can have myriad consequences to structure and function because of the fundamental principles of morphological scaling (Haldane, 1926), resulting in functional trade-offs that ultimately impact evolution and ecology.

The physiological advantages and disadvantages associated with different body sizes have wide ranging effects, from behavior to life history. For example, the smallest animals have the lowest absolute energetic demands (Kelt and Van Vuren, 1999), yet they may also struggle with thermoregulation and be forced to compensate by increasing their metabolism (Scholander et al., 1950; Taylor et al., 1980). Small size enables high performance maneuverability and agility (Domenici, 2001), but may limit maximum attainable speeds (Carrier, 1994; Hirt et al., 2017). Conversely, larger animals may retain heat more easily (Irving, 1973) and exhibit lower mass-specific metabolic rates (Paladino et al., 1990; White and Kearney, 2014) but require greater absolute energy intake (Peters, 1993). While evolution trends towards increasing body size within species lineages, extinction disproportionately affects animals of large body size, in part because of their dependence on a stable environment (Clauset, 2013; Friedman et al., 2010; Holliday, 2005; Smith et al., 2018).

Despite high extinction risk, extremely large size (gigantism) has evolved many times, particularly in the oceans (Clauset, 2013; Vermeij, 2016). The largest marine animals of both the past and present tend to be filter feeders (Friedman et al., 2010). Although aquatic filter feeding has evolved in many diverse invertebrate and vertebrate lineages, different modes of filtration (active, passive) among this feeding guild reflect functional constraints associated with both size. Filter feeders face the unique challenge of ensuring that their filter apparatus is sufficiently large to catch prey to support the cost of increasing body size (Sebens, 1982). For example, passive filter feeders, like sponges and bivalves, rely on water flow to carry particles to their feeding structures (LaBarbera, 1984). In contrast, active filter feeders, such as baleen whales (suborder: Mysticeti), use swimming-induced pressures to drive water through an engulfment apparatus and oral filter (Goldbogen et al., 2017). Among mysticetes, this feeding style has further diversified; balaenid whales are ram filter feeders, while balaenopterid

whales, also known as ‘rorqual whales’, are lunge filter feeders. Some species of rorqual whales, such as blue whales (*Balaenoptera musculus*) and fin whales (*Balaenoptera physalus*), rank among the largest animals of all time. The combination of extreme size and filter feeding may pose unexplored constraints and benefits to foraging performance.

Gigantic body sizes in mysticetes (>15 m in body length) evolved in conjunction with the baleen filter feeding mechanism relatively recently, less than 5 million years ago (Slater et al., 2017). The unique rorqual filter feeding strategy involves the intermittent engulfment of a large prey-laden mass of water that is subsequently filtered through baleen plates that occupy a narrow space between the nearly closed jaws (Werth, 2000). In some large rorqual species, the engulfed water mass is greater than that of their own body (Kahane-Rapport and Goldbogen, 2018). As a result, this lunge feeding mechanism carries a high energetic cost due to high drag, but provides the animal with extraordinary engulfment capacity (Goldbogen et al., 2007). Filtering large quantities of water is energetically efficient when foraging on dense patches of krill (Goldbogen et al., 2019). High density krill patches are frequently found relatively deep in the ocean (Friedlaender et al., 2020; Goldbogen et al., 2011), so air-breathing filter feeders must dive to achieve the energetic efficiency needed to power daily activities and for the long distance migration to breeding grounds (Potvin et al., 2012; Wiedenmann et al., 2011).

For aquatic lineages that push the physiological and biomechanical limits of size and the evolution of complex filter feeding mechanisms, it is unclear how these features affect performance and ecological niche at the upper extreme of body mass. Rorqual foraging performance is a balance between minimizing oxygen use and maximizing energy intake during a foraging dive. In particular, gigantic rorquals likely face functional trade-offs associated with their filter feeding mechanism as well as the conflicting demands of high cost foraging during breath-hold dives. Here we examine the scaling of rorqual feeding morphology and predict how body size both enhances and constrains foraging performance.

Scaling Hypothesis for Rorqual Filter Time

Isometric scaling theory predicts a volume, like the engulfment capacity, should scale with body length in proportion to length³, and that an area, like the baleen area, should scale with body length in proportion to length² (first principles as described by Galileo Galilei, 1638, translated to English (Galilei, 1914)). Filter time is determined by how long it takes the volume of water within the feeding pouch to be purged through the area that the baleen plates

occupy in the mouth (Eqn 1). Therefore, filter time is predicted to be proportional to length¹. We assumed flow speed and pressure drop were invariant across body size because the spacing of the baleen plates (~1 cm between each plate) is consistent across all rorqual species (Werth et al., 2018).

$$\text{Filter Time} = \frac{\text{Engulfment Volume}}{\text{Baleen Area} * \text{Flow Speed}}$$

$$\text{Filter Time} \propto \frac{\text{Engulfment Volume} \propto \text{Body Length}^3}{(\text{Baleen Area} \propto \text{Body Length}^2) * (\text{Flow Speed} \propto \text{Body Length}^0)}$$

[Eq
n 1]

However, Kahane-Rapport and Goldbogen (2018) calculated engulfment capacity of rorqual whales using a two-quarter ellipsoid model of the mouth, (further detailed in (Goldbogen et al., 2010)), and found that engulfment capacity exhibits positive allometry within and across rorqual species (Across species: Engulfment Capacity \propto Body Length^{3.57}) (Fig.1); larger whales have relatively larger engulfment capacities compared to smaller whales. In contrast, Werth et al., 2018 found that baleen area exhibits negative allometry within and across rorqual species (Across species: Baleen Area \propto Body Length^{1.82}) (Fig. 1). Werth et al. (2018) followed Kawamura (1974), using a 2D model to calculate baleen area (Kawamura, 1974). This 2D model calculated the inner (medial) surface of each rack by finding the area of a curved arch-like shape, and assumed this shape represents the filter “window” through which the engulfed water must be purged during the filtration phase.

Using our knowledge of how the scaling of engulfment volume and baleen area diverge from isometry, we can reassess our prediction of how filter time scales in proportion to body length. Engulfment volume scales in proportion to body length with an exponent of 3.57, and baleen area scales in proportion to body length with an exponent of 1.82. Thus, filter time scales in proportion to body length with an exponent of 1.75:

$$\text{Filter Time} \propto \frac{\text{Engulfment Volume} \propto \text{Body Length}^{3.57}}{(\text{Baleen Area} \propto \text{Body Length}^{1.82}) * (\text{Flow Speed} \propto \text{Body Length}^0)}$$

$$\text{Filter Time} \propto \text{Body Length}^{1.75}$$

These data suggest that the differential scaling of baleen area and engulfment capacity act as a fundamental biomechanical constraint to performance, which will be reflected in rorqual foraging behavior as a decrease in lunge feeding events. The positive allometry of engulfment capacity suggests that the cost of lunge feeding also exhibits positive allometry, and thus will progressively limit dive time (Goldbogen et al., 2012). In conjunction with an oxygen limit and a high-cost maneuver, it becomes increasingly important for animals of disproportionately large engulfment volumes to ensure that each lunge target high-density prey. Time and energy spent filtering out a lunge with a sub-optimal prey density will create the greatest burden on those rorquals whose lengthy filter time delays their ability to find a better patch, which we interpret as an ecological constraint. Here we provide an empirical test of this prediction using tag based measurements of filter time and drone-based measurements of body length to determine feeding performance and filter time as a function of body size.

Materials and Methods

Morphological Measures

The engulfment capacity estimates in Fig. 1 are from Kahane-Rapport and Goldbogen (2018) and are summarized here. These engulfment capacity estimates are derived from the Discovery Reports that contain measured morphological data for 33 Antarctic minke whales (*Balaenoptera bonaerensis*), 489 blue whales (*Balaenoptera musculus*), 491 fin whales (*Balaenoptera physalus*), and 51 humpback whales (*Megaptera novaeangliae*) (Mackintosh, 1929; Mackintosh, 1942; Matthews, 1937; Matthews, 1938). Baleen area calculations for eight minke whales, five blue whales, 30 fin whales, and eight humpback whales were taken from Werth et al., 2018 (Fig. 1). Werth et al. (2018) followed Kawamura (1974), using a 2D model to calculate baleen area. Werth et al. (2018) also provided total body length measures for each of the whales. We estimated filter time using these data as described in Eqn 2.

Filtration Rate Calculations: Tag Data

We used motion-sensing suction-cup attached tags (Customized Animal Tracking Solutions, www.cats.is) to collect high sample rate kinematic and behavioral data from 21 blue whales (Monterey Bay), three fin whales (Eastern Greenland and Monterey Bay), nine humpback

whales (Antarctic Peninsula and Monterey Bay), and nine Antarctic minke whales (Antarctic Peninsula) between 2017 and 2019.

For all tag deployments, accelerometers (dynamic range $\pm 39.2 \text{ m/s}^2$) were sampled at 400 Hz, magnetometers and gyroscopes (dynamic range 1000 deg/s) were sampled at 50 Hz, and pressure was sampled at 10 Hz. All data were decimated to 10 Hz before further analysis. Tag orientation was corrected to whale-frame using periods of known orientation, and animal orientation (pitch, roll, and heading) was calculated using custom-written MATLAB scripts (Cade et al., 2016; Johnson and Tyack, 2003). Continuous animal speed was determined using the amplitude of tag vibrations (Cade et al., 2018). Video and sound were recorded concurrently and were aligned with sensor data by the MATLAB script (Cade et al., 2016).

We visualized the kinematic record to identify lunge feeding events (Fig. 2). Lunges have a distinct kinematic signature, similar across all species of rorquals. A lunge is confirmed by (a) fluking associated with a distinct speed maximum and (b) rapid deceleration with some continued forward momentum, due to the engulfed water mass (Goldbogen et al., 2017). After the lunge was determined, we marked mouth opening at the peak in speed, and mouth closing as the point after the sharpest deceleration in speed and as the beginning of the filtration phase (Cade et al. 2016). At mouth close, the ventral groove blubber contains the engulfed water mass, the mass of which slows the forward momentum of the rorqual (Potvin et al., 2009; Simon et al., 2012). This rapid deceleration and subsequent gliding period are visible in the kinematic record. Once the water has been filtered from the pouch, the whale begins fluking and accelerates to prepare for another lunge, or begins ascending to the surface. We marked this point in the kinematic record as the cessation of filtration.

We verified that filtration was occurring during these gliding periods from whale-borne tag video. By using four blue whale video tag deployments, in which the entire engulfment to end of filtration sequence was visible, we determined that blue whale average filter time was $53.84 \pm 4.84 \text{ s}$ (mean, SD). By using two minke whale video tag deployments, in which the entire engulfment to end of filtration sequence was visible, we determined that average filter time was 8.35 ± 1.29 (mean, SD). Thus, we are confident that the kinematic signatures used to identify filter time are accurate because the filter time results from kinematic data alone fall within the range of visually verified filter time. Additionally, dive duration was determined by identifying the elapsed time between surfacing events that were separated by a dive to a depth greater than 50 m with at least one lunge. We only analyzed dives that exceeded 50 m as

behavior close to the surface is not constrained by oxygen and to avoid kinematic data associated with surfacing.

Body Size Measurements: Unoccupied Aircraft Systems Data

We collected high-resolution aerial images using unoccupied aircraft systems (UAS) from 2017 to 2019. Each of the aforementioned tagged whales has a high-resolution image taken around the time of tag deployment.

We used a DJI Phantom 3 Professional quadcopter, a DJI Phantom 4 Pro quadcopter, and two types of hexacopters, the FreeFly Alta6 and a custom Mikrokopter-based LemHex-44, to collect drone imagery. The Phantom 3 Professional quadcopter was fitted with a Sony EXMOR 1/2.3" camera, 4000 by 3000 pixel resolution, and a 94° field of view. The Phantom 4 Pro quadcopter was fitted with a 1" CMOS camera sensor, 5472 by 3078 pixel resolution, and an 84° field of view. Both hexacopters were fitted with a Lightware SF11/C laser altimeter and a Sony Alpha A5100 camera with an APS-C (23.5 by 15.6 mm) sensor, 6000 by 4000 pixel resolution, and either a Sony SEL50mm or SEL35mm focal length low distortion lens. The laser altimeter and cameras were co-located on a 2-axis gimbal with pitch angle controlled via remote control to aid in positioning and ensure image collection at nadir. Measurement errors for all aircraft were calculated by measuring a known sized frame floating at the surface from various altitudes. All aircraft had an average measurement error of < 5%. We used similar methods for hand launch and recovery from small boats as described in (Durban et al., 2016), with the addition of a first-person view (FPV) screen attached to each flight controller giving the pilot a live feed from the photogrammetry camera. The LemHex-44 required a single operating pilot who manually controlled the gimbal and camera's shutter, whereas the Alta6 required two operators, a pilot and camera operator. We collected images in bursts with a high shutter rate of 6 frames/sec (LemHex-44 and Alta6) or on a 2-second timer (Phantom 3, Phantom 4). Measurements were made using MorphoMetriX on images with the whale in full frame lengthwise and as the animal surfaced or was just below the surface (Torres and Bierlich, 2020). Measurement outputs from MorphoMetriX were collated using CollatriX (Bird and Bierlich, 2020).

Water Processed Calculation

We determined how much water a whale processed per dive in both absolute and mass-specific terms. As we had body length for each tagged whale, we estimated engulfment capacity (Goldbogen et al., 2011; Kahane-Rapport and Goldbogen, 2018) and multiplied that capacity by the number of lunges performed in a given dive to determine total water engulfed per dive. Additionally, we estimated mass using the allometric equations detailed in Kahane-Rapport and Goldbogen (2018) to calculate mass-specific engulfment capacity per dive to determine how the mass-specific cost of foraging effects lunge count.

Statistical Analyses to Estimate Filter Time

To test whether the scaling relationship of engulfment capacity and baleen area (i.e., ‘calculated data’, see Eqn 2) robustly estimates filter time measured from tag data, we used a Bayesian generalized linear mixed model, using the MCMCglmm package in R (Hadfield, 2010). For this model, we used UAS-measured body length to predict tag-measured filter time with a random effect of individual to control for pseudoreplication. We expected that the 95% confidence interval of the slope from the relationship of total length to filter time, as modeled using the MCMCglmm, would encompass the value predicted by the calculated data (1.75).

To model the relationship between dive duration and body mass, we used a generalized linear mixed model. We used UAS-measured body length to predict tag-measured dive duration. To test the relationship between the volume of engulfed water and body length, we used a generalized linear mixed model and used UAS-measured body length to predict modeled engulfment capacity. To test the relationship between the mass-specific engulfment capacity and body length, we used a generalized linear mixed model. We used UAS-measured body length to predict mass-specific engulfment capacity. Each model had a random effect of individual to control for pseudoreplication. All models were fit with the lme4 package (Bates et al., 2015) in R (R Core Team, 2019). All variables were \log^{10} -transformed, which is standard practice for investigating ecological scaling relationships (Kerkhoff and Enquist, 2009).

To determine how lunge count per dive relates to body length and mean depth, we used a generalized linear mixed model with a Poisson distribution with a random effect of individual, using the lme4 package (Bates et al., 2015) in R (R Core Team, 2019).

Results

Based on analyses of tag kinematic data, we used 3116 blue whale lunges, 577 fin whale lunges, 788 humpback lunges, and 2578 minke whale lunges to determine filter time for each species (Table S1). Average filter time for blue whales was 60.27 ± 20.36 s, 31.3 ± 11.56 s for fin whales, 17.12 ± 0.595 s for humpback whales, and 8.88 ± 6.09 s for minke whales (mean \pm SD, Table 1). We found that minke whales average 7.48 ± 0.14 lunges per dive, humpback whales average 6.28 ± 0.37 lunges per dive, fin whales average 3.95 ± 0.13 lunges per dive, and blue whales average 4.02 ± 0.05 lunges per dive, during dives at depths > 50 m (mean \pm SE, Table 2). During a foraging dive, we found that minke whales spend 21.43 ± 8.482 percent of their dive time filtering, humpback whales spend 26.845 ± 9.106 percent, fin whales spend 29.630 ± 10.561 percent, and blue whales spend 40.832 ± 11.826 percent dive time filtering (mean \pm SD, Table S2).

The scaling of the calculated morphological data predicted the scaling of foraging behavior from tag data across the species of rorquals in this study. We found that the empirical relationship between filter time and body size had a slope of 1.79; the confidence interval for this value (95% CI: 1.61 - 1.97) encompassed our predicted slope from the calculated data (i.e., the engulfment capacity and baleen area) of 1.75 (Fig. 3).

When controlling for depth, we found that animals of greater body length lunge less per dive. Using a GLMM, we demonstrate that for all species the effect of dive depth on lunge count is positive, meaning that lunge count increases with increasing depth (Poisson GLMM, $z_{40,1313} = 8.821$, $P < 0.0001$). Further, we found that the effect of body length is negative, meaning that lunge count decreases with increasing body length (Poisson GLMM, $z_{40,1313} = -7.056$, $P < 0.00001$).

Further, using a generalized linear mixed model, we found that the relationship between dive duration and body mass across all species had a slope of 0.38 (95% CI 0.33-0.42) (Fig. 4). Large whales engulf more water, in both relative and absolute terms. Using a generalized linear mixed model, we found that the relationship between water engulfed per dive and body length across species had a slope of 3.35 (95% CI 3.17- 3.52). Further, we used a generalized linear mixed model to show that the relationship between mass-specific water engulfed per dive and body length across all species had a slope of 1.10 (95% CI: 1.08 – 1.13) (Fig. 5).

Discussion

The aim of our study was to understand the filtration rate of rorquals across species of different body size. We predicted filtration rate in these animals using two different methods: 1) scaling based on first principles ($\text{Filter Time} \propto \text{Body Length}^1$) and 2) morphological models based on the measured allometries of engulfment capacity and baleen area ($\text{Filter Time} \propto \text{Body Length}^{1.75}$), and then tested these predictions with whale-borne tag data. Empirically, our results from the measured filter time (i.e. using tag data) ($\text{Filter Time} \propto \text{Body Length}^{1.79}$) show that the scaling of the feeding anatomy increases filtration time and results in a biomechanical constraint that affects foraging performance, as predicted. Consequently, the scaling of rorqual morphology predicts the allometry of foraging behavior and performance reasonably well with little deviation.

Our results contrast with previous theories regarding filtration by large rorquals. Alexander (Alexander, 1998) posited that larger filter feeders may use a greater portion of the energy derived from their food intake to drive the filtration process than smaller filter feeders, but also suggested that this constraint could be ameliorated if filter area increased with positive allometry. Increasing filter area is effective for balaenids, like bowhead whales (*Balaena mysticetus*) and right whales (*Eubalaena spp.*), whose baleen plates can reach lengths of 5 meters and 2 meters, respectively (Werth, 2000). Balaenids swim slowly (< 1 m/s) through prey fields (Simon et al., 2009), using their long baleen plates with fine fringes to collect slow moving copepods, and are able to stow these long plates because of complex jaw and skull adaptations (Werth, 2000). Although balaenid baleen area also exhibits negative allometry ($\text{Balaenid Baleen Area} \propto \text{Body Length}^{1.47}$), balaenids have more baleen area per unit body length than rorquals. (Werth et al., 2018).

Our study suggests that instead of increasing baleen area, rorquals have evolved relatively greater engulfment capacities to enhance overall energy intake. As a trade-off, larger whales spend more of their dive time filtering. A blue whale devotes 40% of its dive duration on average to filtration, while a minke whale only devotes an average of 21% of their dive duration to filtration (Table S2). If oxygen stores are isometric ($\text{Oxygen Stores} \propto \text{Body Mass}^1$), the negative allometry of metabolic rate ($\text{Metabolic Rate} \propto \text{Body Mass}^{0.66}$) suggests that dive capacity should increase with body mass ($\text{Dive Capacity} \propto \text{Body Mass}^{0.33}$) (Halsey et al., 2006; Noren and Williams, 2000). This prediction is generally confirmed with direct measures of diving behavior in both mammals and birds ($\text{Dive Capacity} \propto \text{Body Mass}^{0.35}$) (Halsey et al.,

2006). Our analyses of average dive duration from whale-borne tag data show that across species, larger rorqual whales with greater body mass have longer dive durations, Dive Capacity \propto Body Mass^{0.38}, which is very similar to the prediction of Dive Capacity \propto Body Mass^{0.35} from Halsey et al., 2006. While this benefit of larger body size would seemingly allow animals to dive deeper and lengthen their search for food (Doniol-Valcroze et al., 2011), thereby improving their foraging performance and fitness (Schoener, 1989), larger whales have devoted substantial proportions of their increased dive time to filtering engulfed water.

We interpreted the scaling of filter time in rorquals, a product of the allometry of the filter feeding apparatus, as a biomechanical constraint. If true, this constraint does not exist in isolation from rorqual foraging ecology. The relatively longer filter time (the biomechanical constraint) in larger rorquals shortens the time that could be spent searching for high quality prey patches. Thus, if a whale lunges upon a patch that is small or not dense, it will result in less energetic gain per unit time. Given that lunge feeding is energetically costly, rorquals are reliant on hyper-dense prey patches proportionate in size to their engulfment capacity. Intense seasonal upwelling can facilitate these large prey swarms that allow rorquals to meet, and often exceed, their daily energetic demands (Goldbogen et al., 2019; Slater et al., 2017). Without these ideal patches, they face an ecological constraint that may negatively affect reproduction and survival (Goldbogen et al., 2019). However, if larger rorquals could modulate the volume engulfed in proportion to the size of the prey patch, the cost of a lunge would be reduced. Alternatively, rorquals may choose not to forage on small, low quality prey patches and instead search for higher quality prey fields at other locations.

Large whales, like blue and fin whales, often forage in the open ocean along edges of canyons, where space is not limiting and krill can aggregate in large patches or layers (Genin, 2004). Although larger rorquals lunge less frequently, their enormous engulfment capacity leads to more water processed per dive, both in absolute and mass-specific terms (Fig. 5). This mechanistic explanation, wherein the amount of prey consumed per dive increases with increasing engulfment capacity, ameliorates the physiological and biomechanical constraint of longer filter time and allows for the evolution of gigantism in this lineage (Goldbogen et al., 2019). This high efficiency foraging is critical for rorquals to support the energetic demands of extreme size, as well as to account for reduced feeding efforts during migration and reproduction. The mitigation of the biomechanical constraint is dependent upon the presence of incredibly vast yet ephemeral prey patches. If dense, high quality prey is not limiting, larger

whales will engulf more krill than smaller whales with each lunge (Fig. 5), circumventing the ecological constraint.

We sought to determine the maximum number of lunges executed per dive as this count may reflect a physiological limit given optimal prey density and distribution (Friedlaender et al., 2016; Goldbogen et al., 2012; Hazen et al., 2015). In presumably optimal foraging conditions, maximum lunge count per dive in minke whales (18) was twice that of much larger fin whales (9) and higher than the blue whales (11) (Table 2). While we excluded lunges that occurred at depths shallower than 50 meters in our analysis, a tagged minke whale in our records performed 22 lunges per dive, albeit at 40 meters. Even greater lunge rates were recorded by Friedlaender et al (2014), who recorded a minke whale lunging 24 times per dive (Friedlaender et al., 2014). These details highlight the complexity of explaining lunge rate without concomitant prey data. While lunge count is definitively influenced by body size, other factors such as prey density and prey type contribute to the choice of when and where to perform a high cost-high yield maneuver (Friedlaender et al., 2019; Goldbogen et al., 2015). Although we only compared foraging rates of krill-feeding rorquals, some rorqual species also exploit other patchy prey like forage fish. We would expect the lunge count per dive, dive duration, and mean dive depth to vary based on the behavior of the fish school. Fish behavior drives the lunge rates and other variables more than oxygen and physiological limitations (Cade et al., 2020).

Nevertheless, our results on size-dependent performance may reflect how different sized rorquals have evolved prey preferences, broadly defined. Smaller body size and smaller gulps lead to less prey intake per unit effort. However, smaller size provides the flexibility needed to hunt in complex environments and upon smaller or unevenly distributed prey patches to satisfy relatively lower energetic needs. The biomechanical constraint is present, but does not compound the ecological constraint for small rorquals. In contrast, the increased filter time of larger rorquals curtails foraging performance by decreasing lunge count per dive, but because of extraordinary engulfment capacity, larger rorquals can collect more prey per unit body mass during a dive. The biomechanical constraint becomes increasingly limiting for larger rorquals, and if a large rorqual cannot find a high-density prey patch, they ultimately face an ecological constraint. The smaller rorquals, like minkes, are less constrained by both their environment and biomechanics, and therefore may be similarly less limited in terms of prey preference and ecological niche. Accordingly, rorquals appear to trade-off body size and protection from predation (Ford, 2008) for variable habitats and prey distribution flexibility. In a changing environment that may disrupt trophic linkages and the formation of prey patches (Fleming et

al., 2016), larger, prey-specialist whales may be more susceptible to changes in these distributions given that they must focus foraging efforts on only a few select feeding events.

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Competing interests

The authors declare no competing or financial interests.

Author Contributions

SRKR, MSS, and JAG developed the ideas for this paper. SRKR and JAG compiled the manuscript. All authors contributed to reading and editing manuscript drafts. SRKR, JAG, AJW collated the morphological data. SRKR, DEC, PSS, JAC, JAF, and ASF collected the tag data. KCB, JD, DWJ collected the drone data. SRKR, DEC, WTG, JAF, PSS, KCB curated, processed, and analyzed the data along with MSS and JAG. Funding was acquired by ASF and JAG.

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Data Availability

The datasets supporting this article are available at <https://doi.org/10.5061/dryad.n5tb2rb2>.

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Figures

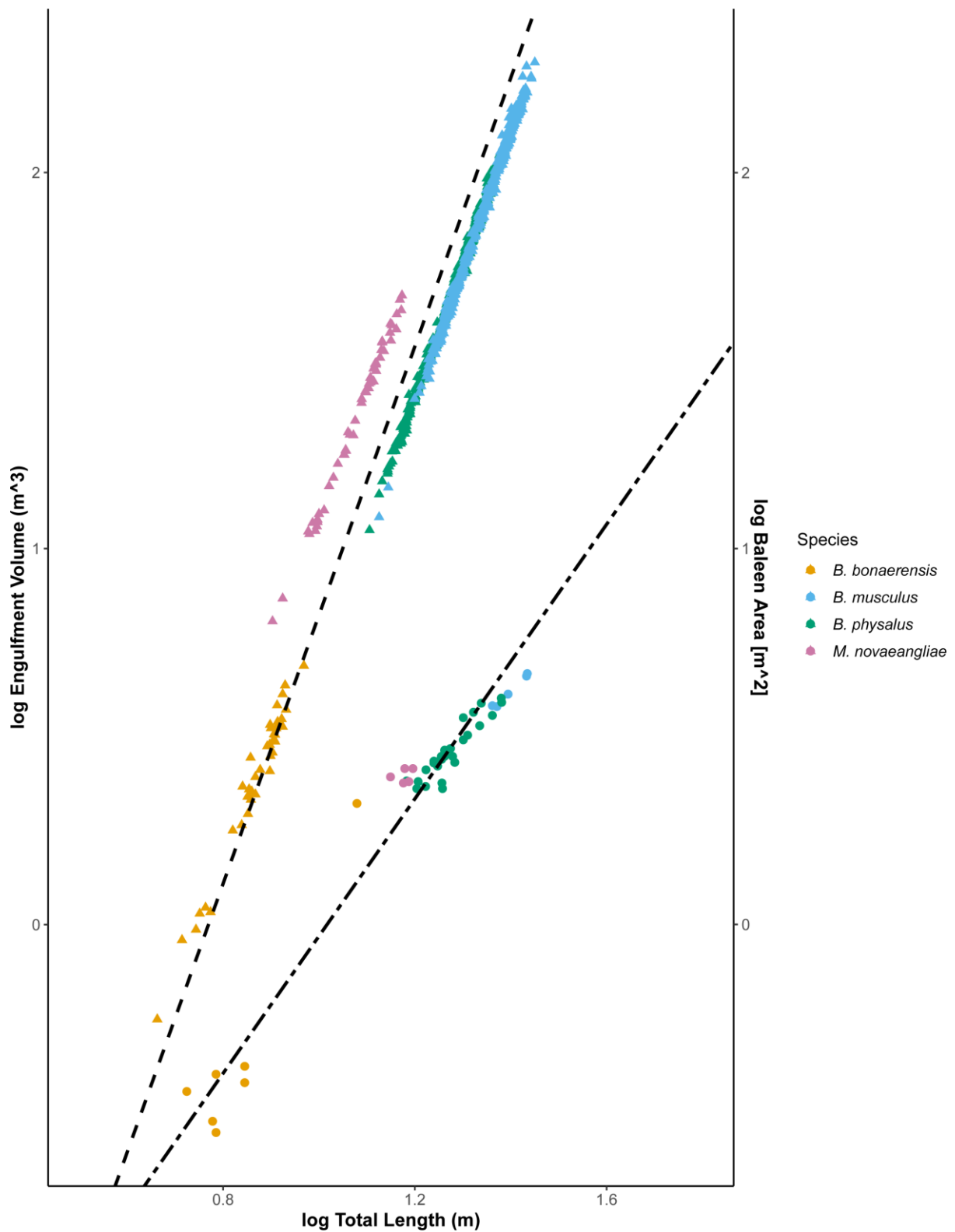


Fig. 1: Scaling of engulfment capacity volume (EV) (Kahane-Rappoport and Goldbogen, 2018) and baleen area (BA) (Werth et al., 2018) in four rorqual species (Blue whale,

Balaenoptera musculus; fin whale, *Balaenoptera physalus*; humpback whale, *Megaptera novaeangliae*; Antarctic minke whale, *Balaenoptera bonaerensis*). Each point represents an individual whale; data from 33 minke whales, 489 blue whales, 491 fin whales and 51 humpback whales were used for EV calculations and data from eight minke whales, five blue whales, 30 fin whales, and eight humpback whales were used for BA calculations. The dashed line represents the linear regression for engulfment capacity volume (slope = 3.57; intercept = -2.75, CI: 3.56 - 3.58) and the dot-dash line represents the linear regression for baleen area (slope = 1.82; intercept = -1.855; CI: 1.71 - 1.939).

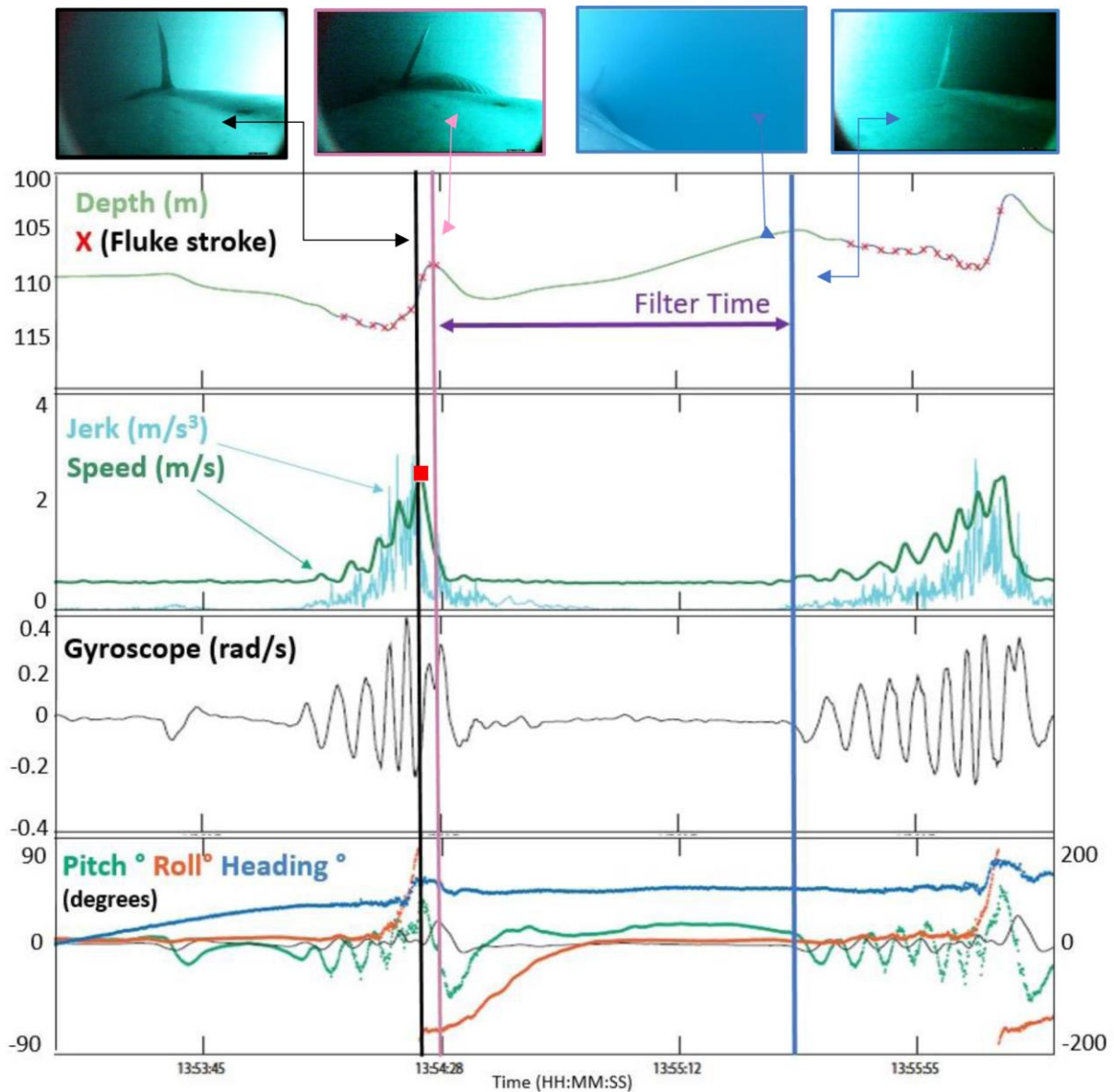


Fig.2: **Example kinematic signatures used to identify filter time from a blue whale deployment.** The lunge is marked by the red square, the vertical black line represents mouth opening, the vertical pink line represents mouth closure, and the vertical blue line represents the end of filtration. Images above are from a tagged blue whale, showing whale behavior aligned with the concurrent kinematics.

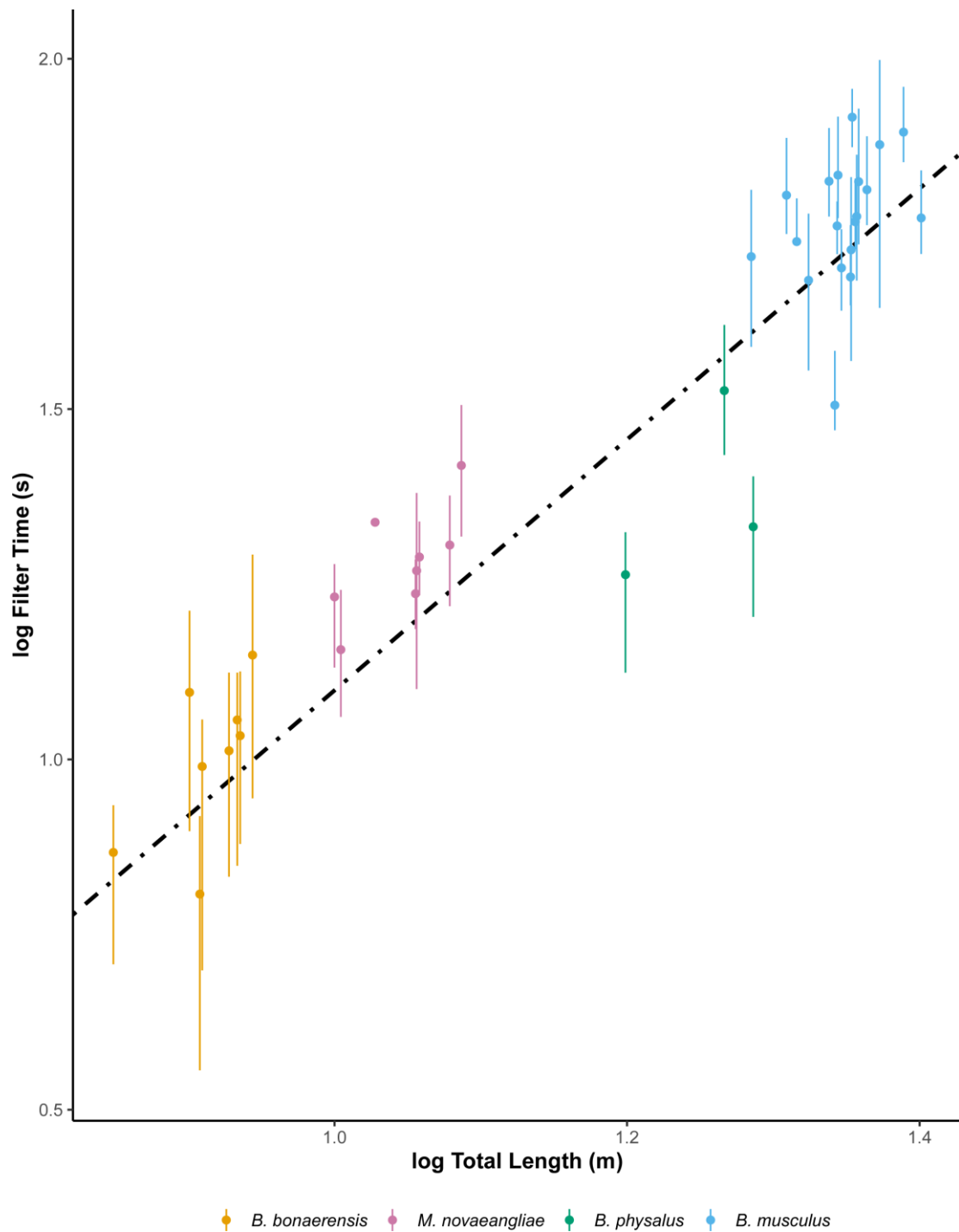


Fig.3 Scaling of mean filter time (s) in four rorqual species as a function of total length (m) measured using UAS imagery. Nine minke whale deployments, three fin whale deployments, 21 blue whale deployments and eight humpback whale deployments were used in this analysis. Bars on each point represent interquartile range (25%-75%). Dashed line represents a general linear mixed model (slope = 1.79; intercept = -0.692; CI: 1.61 - 1.97).

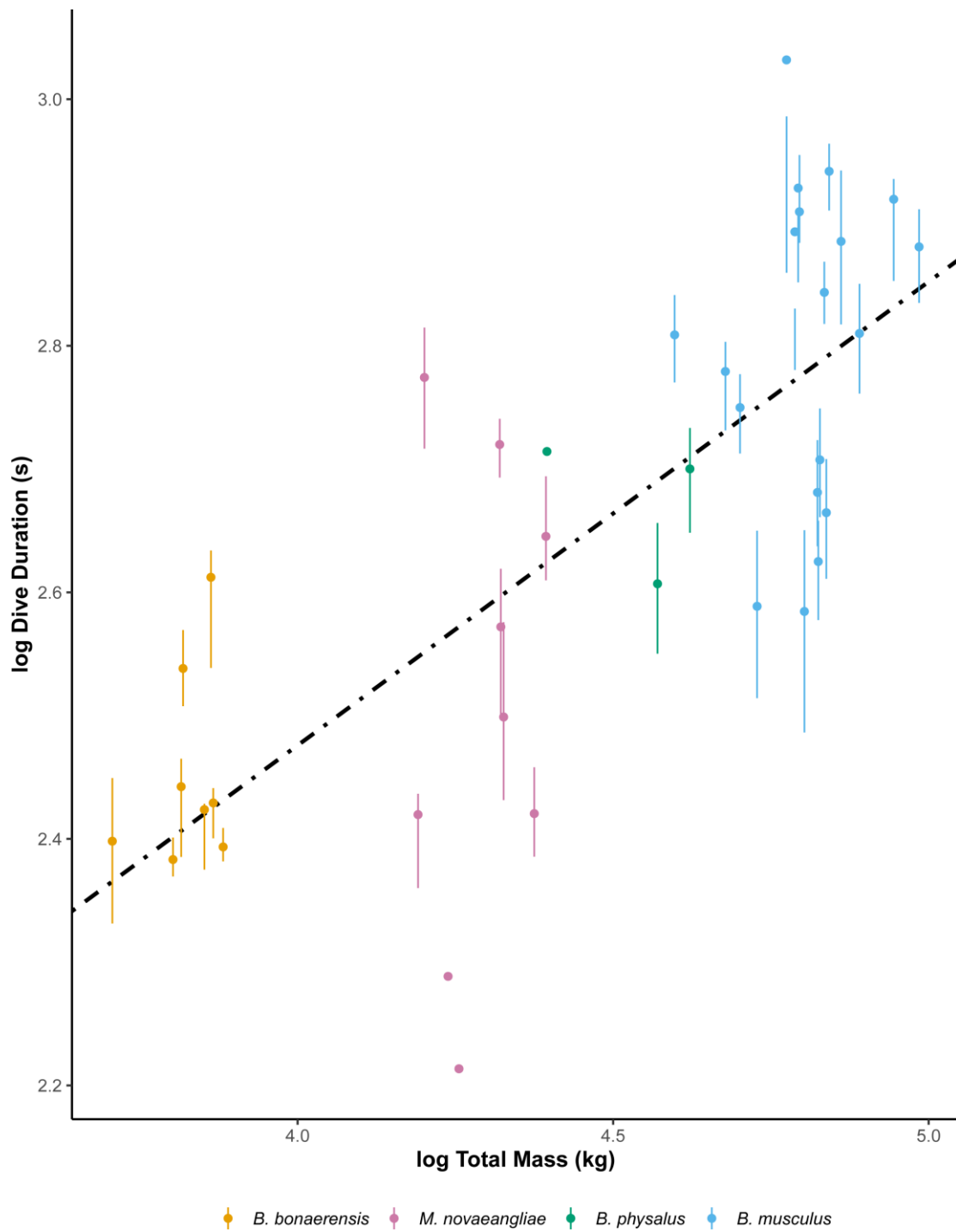


Fig. 4: **Mean dive duration (s) increases with total body mass (kg)**. Nine minke whale deployments, three fin whale deployments, 21 blue whale deployments and nine humpback whale deployments were used in this analysis. The bars on each point represent the interquartile range (25%-75%). Dashed line represents a general linear mixed model (Slope = 0.376; intercept = 0.971; CI: 0.329 – 0.423).

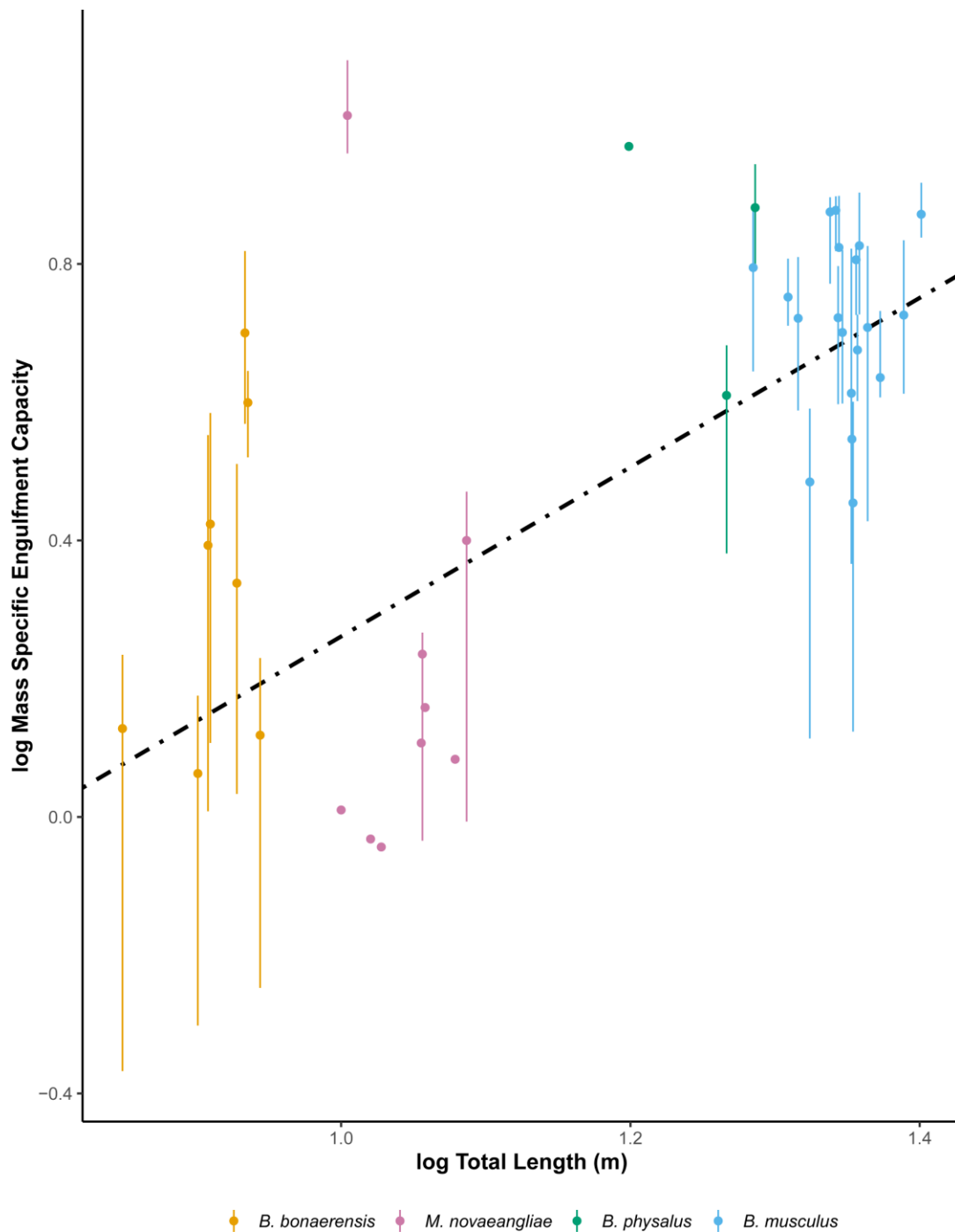


Fig. 5: **Mean mass-specific engulfment capacity increases with total body length (m), measured using UAS imagery.** Nine minke whale deployments, three fin whale deployments, 21 blue whale deployments and nine humpback whale deployments were used in this analysis. The bars on each point represent the interquartile range (25%-75%). Dashed line represents a general linear mixed model (Slope = 1.22; intercept = -0.96; CI: 1.036 – 1.41).

Tables

Table 1. Average filter time (s) varied by species

Species	n	Mean (s)	SD
<i>Minke</i>	9	8.88	6.09
<i>Humpback</i>	8	17.12	5.95
<i>Fin</i>	3	31.3	11.56
<i>Blue</i>	21	60.27	20.36

Table 2. Average, median, and maximum number of lunges per dive deeper than 50 m, varied by species

Species	n	Mean	Median	SE	SD	Maximum
<i>Minke</i>	9	7.48	7.0	0.14	2.53	18
<i>Humpback</i>	8	6.28	5.0	0.37	3.99	16
<i>Fin</i>	3	3.95	4.0	0.13	1.60	9
<i>Blue</i>	21	4.02	4.0	0.05	1.47	11

Table S1: Mean lunge count per dive and number of dives for individual rorquals

ID	Mean Lunge Count Per Dive	SD	Number of Dives with >0 Lunges
bb180304-42	5.181818	2.9310253	11
bb180304-45	9.135417	4.5942392	96
bb190225-54	2.314815	1.2753276	162
bb190225-55	2.320225	1.3096851	178
bb190228-55b	3.758065	3.0104158	124
bb190302-48	7.2	1.7002674	15
bb190302-52	4.849918	2.843638	613
bb190302-53	4.035088	2.3727213	228
bb190306-52	2.625806	1.2822481	155
bp170907-41b	3.385621	1.3156308	153
bp180828-44	6.058824	2.0920016	17
bp180830-53	9	0	1
bw170813-44	2.141935	0.994199	155
bw170814-31	3.8	1.155023	60
bw170814-40	3.088542	1.6078527	192
bw170814-50	3.555556	1.0269987	45
bw170814-51	4.078125	1.4755035	64
bw170815-21	2.65	0.7324211	20
bw170815-28	2.349593	1.1275966	123
bw180827-52	3.205128	0.6890581	39
bw180827-53	3.714286	0.46291	7
bw180828-48b	5.344828	1.1291856	29
bw180828-49	5.052632	0.8908791	38
bw180829-30	4.4	1.02841	20
bw180829-47	3.8125	1.7309109	32
bw180830-40	4.806452	1.2358597	31
bw180830-46	4.944444	1.3234698	18
bw180830-48	5.714286	2.4319305	7

bw180830-52b	5.727273	1.3055824	11
bw180904-44	4.904762	1.3823376	2
bw180904-52	4	1.1881771	6
bw180905-49	6	1.1766968	35
bw180905-53	3.897436	1.2204056	39
mn170703-40	12.48	2.3844088	25
mn170815-10	2.55	2.1267067	20
mn180227-40	1.083871	0.481845	155
mn180227-41	1.250804	0.7448208	622
mn180227-43	1.245881	0.8122314	789
mn180227-44	1.552174	1.3045759	230
mn180227-46	1.039179	0.2293517	536
mn180302-27	1.861702	1.3866733	282
mn180302-47	1.386861	1.2206272	548

Table S2: Percent filter time spent per dive by species

Species	n	Mean	SE	SD	Maximum
<i>Minke</i>		21.438	0.476	8.482	43.086
<i>Humpback</i>		26.845	0.857	9.106	45.458
<i>Fin</i>		29.630	0.877	10.561	59.312
<i>Blue</i>		40.832	0.434	11.826	65.706