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Supplementary Materials for

Low hunting costs in an expensive marine mammal predator

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Multivariate mixture model to distinguish actual dives from regular apneas.

Dive thresholds have been typically defined *a priori* depending upon dive depth or duration. However, a preliminary exploration of the data demonstrated that this traditional definition was poorly suited to the tagged porpoises with extremely short and shallow dives, and foraging at all depths. We used a gaussian multivariate mixture model (*Mclust* in the R package *mclust* (version 5.4.10 (58)) on the log-transforms of inter-breath interval (IBI) duration, depth and average activity (i.e., meanMSA) to distinguish *actual dives* from *apneas*. We tested multiple scenarios for the number of clustering groups, where the most parsimonious model (highest log-likelihood) classified IBIs into 3 groups (Fig. S1). The group with IBIs of the longest duration, the deepest depth and highest activity, encompassing 14290 IBIs, was classified as actual dives, while the remaining two groups, likely comprising regular apneas (n = 47232) and logging periods (n = 6915) were classified as apneas.

Exploration of the apneas, both regular apneas and logging periods, demonstrated that the median duration and maximum depth of the apneas were 9 s and <1 m, with 95% of them being less than 20 s and shallower than 2 m (Fig. S2). Apneas had low circular variation of the roll (median = 0.01, Inter-Quartile Range = 0.02) compared to the actual dives (median = 0.12, Inter-Quartile Range = 0.22) (Fig. S2), and less than 3% of them contained buzzes.



Fig. S1. Scatter plots of the natural log-transformed inter-breath intervals (IBI) duration, maximum depth and average activity (meanMSA) for the 20 free-ranging harbor porpoises. The color and shape depict the results of the best multivariate mixture model. Centroids of each group are [3.90 1.79 0.77] (orange), [2.11 -0.10 0.66] (green) and [1.66 -1.74 -0.04] (blue). The group with IBIs of the longest duration, the deepest depth and highest activity (orange) was classified as *actual dives*, while the remaining two groups (green and blue) were classified as *regular apneas* and *logging periods*, respectively.



Fig. S2. Proportion of IBI as a function of IBI category (apneas vs. actual dives). A) IBI duration, B) maximum depth, and C) circular variance of the roll of free-ranging harbor porpoises as a function of IBI category: *apneas* (n = 54147) and *actual dives* (n = 14290).



Fig. S3. State-dependent distributions estimated from the best Hidden Markov Models (HMM) for categorizing dive types of harbor porpoises from Danish waters.



Fig. S4. Causal diagram or Directed acyclic graph (DAG). Causal relationship of the variables used in the study (built through dagitty.net using Textor et al. (69). In a DAG, variables are depicted as nodes and connected by arrows referring to the direction of the causal relationship. DAGs contain both causal and non-causal pathways: a causal pathway has an arrow pointing away from the main explanatory variable going towards the outcome; a non-causal pathways connect the main explanatory variable and outcome via a pathway with at least one arrow directed against the flow of time. For more details see Hernán and Robins (66).



Fig. S5. Respiration rate as a function of average activity of the lower 95th percentile of MSA (meanMSA) of the 20 tagged harbor porpoises from the Kattegat and Belt Seas summarized A) **post-dive and B**) in 20-minute intervals. Dots are color-coded by behavioral state. Note that we chose to use 20-minute bins as they correspond to 10 times the 95th percentile of the dive cycle duration of the tagged porpoises.



Fig. S6. Metabolic scope in harbor porpoises as a function of behavioral state. Relationship between respiration rate and buzz rate over 20-minute intervals. A) Observations are color-coded by ID and the shape relates to behavioral state. B) Dots are color-coded by behavioral state. Note that we chose to use 20-minute bins as they correspond to 10 times the 95th percentile of the dive cycle duration of the tagged porpoises.







Fig. S8. Per-dive buzz count as a function of time since tag deployment for the tagged 20 harbor porpoises. The dashed green line is a Generalized additive model (GAM) with penalized cubic regression splines (i.e., default method in the *geom_smooth* function of the *ggplot2* package in R), and orange line shows the cumulative sum of number of buzzes over the deployment time expressed as percent proportion of the total number of buzzes. The shaded area represents nighttime.

Fig. S9. Overview of diving, feeding and breathing behavior of the 20 tagged harbor

porpoises. Each graph represents one porpoise. (A) Dive profile of the harbor porpoise with preycapture attempts (defined by echolocation buzzes) marked in red. (B) One-minute (dark red) and 20-minute (light red) buzz counts. C) Respiration rates averaged over 20-minute periods (orange) and 95th percentile of minimum specific acceleration (MSA, a proxy for activity) averaged over 5second (green) and 20-minute periods (yellow). D) Energy balance calculated as the cumulative difference between the energy gained from prey captures and the metabolic energy expended (estimated via respirations). Starting from a null energy balance, 0 MJ, positive energy balance is depicted in green and negative in orange. The average energy turnover per respiration is calculated following Rojano-Doñate et al., (*13*), and the average energy per prey capture is calculated using the estimated field metabolic rate of the individual (calculated following Rojano-Doñate et al., (*13*)) divided by the total number of prey-capture attempts assuming a 90% assimilation efficiency. We assumed the calorific value of prey (i.e., fish) to be 4.2 kJ g⁻¹(*18*). The shaded area represents nighttime. Dashed lines in B and C represent incomplete 20-minute periods.



2) hp12_293a



3) hp13_102a







8) hp15_117a





11) hp16_264a





13) hp17_135a





15) hp18_120a









19) hp19_221a





Fig. S10. Illustration of the aspect of the auditing tool in MATLAB, showing a respiration and a buzz (i.e., bio-sonar based prey-capture attempt). In the top panel, relative sound amplitude, spectrogram in the middle panel, and depth profile in the bottom panel.



(A) Respiration

Table S1. Dive parameters of the 20 tagged harbor porpoises tagged in the Kattegat and Belt Seas. Total buzz count refers to the total buzz number of the complete deployment. Buzz rate (day⁻¹) is only calculated for deployments longer than 20 hours. The digits in the individuals' ID indicate the year and Julian day of tag deployment. Animals are sorted according to increasing standard body length. Note that total buzz counts differ slightly from Wisniewska et al., (*10, 52*) because buzzes were reanalyzed to have a uniform buzz detection methodology across years. *accompanied by another porpoise, most likely its own calf. †potentially pregnant. ‡excluding first hour of deployment.

ю	Length (cm) - Sex (age)	Deployment duration (nighttime) (h)‡	Proportion of time					Max. dive	Total	Daytime	Nighttime	_
			Diving	Non- feeding	Pelagic feeding	Bottom feeding	Max. dive depth (m)	duration (min)	buzz count	buzz rate (h ⁻¹)	buzz rate (h ⁻¹)	Buzz rate (day ⁻¹)
hp18_134a	111 \bigcirc (juvenile)	43.2 (15.8)	0.75	0.50	0.44	0.06	80	4.4	4242	59	167	2364
hp16_316a	113 ♂ (juvenile)	38.5 (29.5)	0.41	0.02	0.60	0.39	20	1.7	4300	65	126	2687
hp13_102a	114 👌 (juvenile)	22.7 (10.3)	0.65	0.53	0.33	0.14	18	2.8	3046	11	283	3236
hp19_262a	115 ♂ (juvenile)	26.0 (14.2)	0.47	0.29	0.47	0.25	41	2.2	2037	77	80	1886
hp18_254a	116 ♂ (juvenile)	7.7 (0.8)	0.77	0.22	0.68	0.10	16	2.3	1450	16	209	-
hp18_120a	120 ♂ (juvenile)	30.3 (20.5)	0.61	0.38	0.34	0.27	34	4.5	3054	53	202	2427
hp15_267a	121 ♂ (juvenile)	21.4 (12.1)	0.83	0.34	0.48	0.18	48	3.3	1238	14	91	1389
hp12_272a	122 \bigcirc (juvenile)	20.9 (12.5)	0.8	0.72	0.27	0.01	23	2.1	1689	21	122	1948
hp18_151a	122 ♂ (juvenile)	9.0 (0)	0.68	0.37	0.27	0.36	29	2.0	530	59	-	-
hp13_170a	123 👌 (juvenile)	14.3 (4.0)	0.77	0.31	0.16	0.54	14	3.6	1256	53	180	-
hp19_221a	124 👌 (juvenile)	12.1 (4.4)	0.76	0.04	0.51	0.44	9	2.4	2297	166	235	-
hp14_226b	126 👌 (juvenile)	20.7 (9.1)	0.72	0.32	0.61	0.06	27	2.5	3262	131	192	3784
hp15_096a	128 👌 (juvenile)	9.8 (9.8)	0.72	0.35	0.50	0.15	38	2.4	804	-	82	-
hp13_145a	135 \bigcirc (juvenile)	5.8 (0)	0.56	0.49	0.38	0.13	18	2.1	208	36	-	-
hp17_135a	137 👌 (adult)	12.5 (7.3)	0.48	0.55	0.35	0.10	27	1.7	598	17	70	-
hp18_095a	143 👌 (adult)	21 (10.8)	0.56	0.43	0.24	0.32	20	3.3	3083	44	243	3542
hp15_160a†	145 ♀ (adult)	22.2 (6.3)	0.54	0.35	0.03	0.62	15	2.0	458	16	31	497
hp12_293a*	163 \bigcirc (adult)	16.7 (11.1)	0.66	0.37	0.40	0.23	50	2.7	1131	19	93	-
hp16_264a*	163 \bigcirc (adult)	10.9 (4.6)	0.67	0.62	0.19	0.19	19	2.2	403	5	81	-
hp15_117a†	170 \bigcirc (adult)	12 (9.3)	0.54	0.27	0.40	0.33	27	3.6	730	50	64	-
MEAN	131	18.9	0.65	0.37	0.38	0.24	29	2.7	1791	48	142	2376

Before \After	Non-feeding	Pelagic feeding	Bottom feeding
Non-feeding	0.89	0.07	0.04
Pelagic feeding	0.07	0.90	0.03
Bottom feeding	0.09	0.07	0.84

Table S2. Transition probabilities between behavioral states of the most parsimonious Hidden Markov Model (HMM) for categorizing dive types of harbor porpoises in the Kattegat and Belt seas.

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