Using accelerometry to quantify prey attack and handling behaviours in piscivorous pike *Esox lucius*

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1 BRIEF COMMUNICATION

2

3 TITLE: Using accelerometry to quantify prey attack and handling behaviours in piscivorous pike
4 *Esox lucius*

5

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21 KEY WORDS: accelerometer; *Esox lucius*; foraging; handling time; predation

22

23 ABSTRACT:

24 Predator-prey interactions play a central role in structuring aquatic food webs. Technical
25 development that offers opportunities to observe predator behaviour also in the dark or in humic
26 waters is therefore warranted. Here we use accelerometer technology to evaluate behaviours in the
27 teleost ambush predator pike *Esox lucius* foraging on crucian carp. Automated rule-based estimates
28 of prey-size determined handling time were obtained and are compared to video-recorded
29 behaviours. Solutions to tag attachment and the limitations imposed by battery-time and data-
30 logging capacities are evaluated.

31

32 MANUSCRIPT:

33 Piscivore predation plays a central role in structuring aquatic food webs (Kerfoot and Sih 1987,
34 Carpenter and Kitchell, 1993). Predation is performed by individuals, and to bridge the order scales
35 between individuals and systems, we need better identification of what factors and mechanisms
36 influence behaviour and decision-making in individual predators (Fryxell and Lundberg, 1998).
37 Fish are commonly apex predators in aquatic systems, but direct observation of their behaviour in
38 nature is challenging (e.g. Jepsen et al. 2001). Studies are therefore commonly restricted to small
39 scale laboratory settings (e.g. Nilsson et al., 2000), but even here the opportunity to make
40 observations directly or by camera relies on sufficient visibility and proper light conditions (e.g.
41 Jönsson et al., 2013). Studies on fish predator-prey interactions in darkness or in highly turbid or
42 humic water are hence scarce for logistical reasons. Technical development however offers

opportunities to quantify predator behaviours also in the absence of visual signals. For example, conventional telemetry techniques can aid the collection of positional data (Marsac & Cayré, 1998), physiological telemetry techniques can monitor heart rate frequency (Priede, 1983), data storage tags can supply information on e.g. depths and temperature across visibilities and habitats (Stensholt, 2001), and accelerometers can measure and monitor behavioural activities (Broell et al. 2013).

This study evaluates the use of accelerometer tags for indirect observation of piscivore-prey interactions using the ambush predator pike *Esox lucius* L. 1758 as model species (Craig, 1996, Forsman *et al.*, 2015). Accelerometers have previously been used for different applications in fish behavioural studies, such as the measurement of burst swimming performance (Franklin *et al.*, 2003), activity patterns and energy expenditure (Murchie *et al.*, 2011; Wright *et al.*, 2014), fast start behaviour (Noda *et al.*, 2013), foraging behaviour (Broell *et al.*, 2013; Brownscombe *et al.*, 2014; Kawabata *et al.*, 2014), and mating and spawning behaviour (Tsuda *et al.*, 2006; Whitney *et al.*, 2010). While previous studies have focused on distinguishing between different types of behaviour (i.e. foraging vs. escaping), the present work also evaluates the prospects of applying accelerometry to estimate handling time and prey size in situations where visual observation techniques are logistically impossible. Furthermore, as for pike, fast-start performance and prey capture dynamics have until now only been evaluated using video techniques (Webb & Skadsen, 1980; Rand & Lauder, 1981; Frith & Blake, 1991; Harper & Blake, 1991).

The accelerometer tag (2.3g (air), 25x12mm, 1.55V silver-oxide button cell (V389, Varta AG)) contained a 3-axis MEMS (Micro-Electro-Mechanical-System) accelerometer sensor and a 2Mbit memory. The accelerometer was set in low-power, “wait-for-movement”-state, and data collection was triggered by an acceleration threshold at $\pm 1.5g$ ($g=9.82m\ sec^{-2}$) for more than 0.2 sec, indicative of attack behaviour. The threshold level was established when preparing for the study by

67 gradually increasing the threshold until activity events, that were not attacks, no longer triggered the
68 data-logger (in total 5 preliminary trials without prey fish was made). The data logger then
69 continuously recorded acceleration with 12-bit resolution at 100 Hz during 7 minutes. To avoid
70 accidental triggering of data collection prior to or during tag attachment, the tag was pre-
71 programmed with time of tag activation.

72

73 Two pikes (35 and 37 cm) were caught by electrofishing in the Lake Krankesjön, southern Sweden,
74 and directly transported to the Ecology building, Lund University. Prior to and during the
75 experiment, pike were individually held in a 200 × 50 × 50 cm aquarium (water depth: 15 cm)
76 divided into two equally sized compartments by a sheet of grey PVC. Before each trial, a Velcro
77 tape (15×7 mm) was glued (Loctite super attack) to the accelerometer tag, and the matching part of
78 the Velcro was glued dorsally to the hard part of the pike head using veterinary glue (3M Vetbond,
79 Fig. 1a) c. 24 hours before activation of the accelerometer tag. Attaching the tag to the head rather
80 than the body allowed for detection of head shaking during prey handling. The accelerometer tag
81 was then carefully attached to the pike by connecting the two matching Velcro parts. This was done
82 approximately three hours prior to the pre-programmed tag activation time, and without any
83 handling or removing of pike from the aquarium. To trigger natural attack behaviour in predatory
84 fish, dead prey is often inadequate (see also Broell *et al.*, 2013). Therefore, an individual life
85 crucian carp *Carassius carassius* L. 1758 (length: 7.2-12.0 cm) was placed under a non-transparent
86 plastic container (14×10×20 cm) in one of the short ends of the arena five minutes before tag
87 activation time. Ten minutes later, i.e. five minutes after tag activation, the prey was released by
88 removing the container via a remote pulley system. Activity was monitored and recorded by a
89 surveillance system (Timihillone H264) with a camera (Logitech C920HD) centrally located above
90 the experimental arena. Experiments were performed under evaluation and permission from the

91 Malmö/Lund authority for ethics of animal experimentation (licence M36-14), and the use of live
92 prey fish here, were comparable to Broell *et al.* (2013) and in Kawabata *et al.* (2014). Furthermore,
93 in order to minimize the potentially harmful treatment of the prey fish, number of predators and the
94 number trials was reduced as much as possible without compromising the conclusions. Also a novel
95 and non-invasive (i.e. skin or flesh penetration) way of attaching the data-logger to the predator was
96 applied.

97

98 Data from the accelerometer tag consisted of acceleration along the x, y, and z axes recorded at 100
99 Hz. This three-dimensional data was translated to one-dimensional acceleration using vector norm
100 calculations $MA = \sqrt{x^2 + y^2 + z^2}$ according to Broell *et al.* (2013). The accelerometer-based
101 handling time (h_a) was computed as the time period (sec) between the start of the attack that
102 triggered the data logger until MA fell below a threshold value (τ) of $MA = 1.5$. The accuracy of h_a
103 values were validated by comparison with video recorded handling times, where two definitions of
104 handling time were applied when determining observed handling time: time from start of the attack
105 until the pike completely stopped moving (h_1) (this definition allowed unsuccessful attacks to be
106 considered), and time from the start of the attack until the prey was completely engulfed (h_2 , only
107 applied to successful attacks). The sensitivity of h_a to τ was evaluated for values of τ from 1 to 2 in
108 steps of 0.1. Sensitivity to data logging frequency was evaluated by comparing the h_a values
109 derived from the original data sets to h_a values derived from modified data sets where only every
110 tenth data point was included (simulating a data-logging frequency of 10 Hz).

111

112 The video recordings confirmed that the accelerometer tag was activated only when the pike
113 attacked a prey, and no attacks took place without activating the tag. In total, eight successful trials

114 were completed (5 for pike-1 and 3 for pike-2). Trials were considered unsuccessful if the pike was
115 uninterested in the prey, the video recordings failed, tag pre-programming was erroneous, or the tag
116 detached prior to or during the trial. Video footage revealed that half of the successful trials resulted
117 in a successful attack where the prey was swallowed (both pikes displayed successful and
118 unsuccessful attacks). Unsuccessful attacks were either a single unsuccessful strike with no prey
119 handling, or on two occasions, successful strikes was followed by unsuccessful attempts to hold or
120 turn the prey. The accelerometer tag produced 3D data on movement that were readily transformed
121 to one-dimensional *MA* for analyses (Fig. 1).

122 The computerized accelerometer-based handling time (h_a) was significantly correlated to the
123 observed handling time. The best correlation was found for h_a versus h_1 (Linear regression: $r^2 =$
124 0.93 , $F_{1,7}=97.28$, $p < 0.001$) and only slightly off the 1:1 relationship (i.e. small underestimation of
125 h_1) (Fig. 2a). However, in the case of the observed handling time fulfilling definition 2 (h_2 ,
126 completely engulfed prey) the performance of the accelerometer was poorer. Even though the
127 relationship was still highly significant (Linear regression: $r^2=0.87$, $F_{1,7}=47.1$, $p < 0.001$), the
128 computed h_a values were to a much larger extent underestimating the observed handling times (Fig.
129 2b). The computation procedure of h_a was relatively insensitive to the selected threshold (τ) (Fig.
130 2c) and to a reduction in data-logging frequency from 100 Hz to 10 Hz (Fig. 2d). Reducing the
131 frequency did, however, result in loss of handling events lasting less than c. 1 s (i.e. failed to detect
132 one successful and two unsuccessful attacks at 10 Hz). A previous study, differentiating between
133 attack behaviour and other types of standard behaviours, also found that reducing the frequency is
134 potentially problematic (Broell *et al.*, 2013). Lastly, it should be noted that in a few occasions a
135 single brief *MA* spikes exceeding default τ ($MA = 1.5$) was observed long after completed prey
136 capture and handling. However, these spikes never exceeded $MA = 2$ and lasted less than 0.2 sec,
137 and was therefore easily distinguished from unsuccessful attacks.

138 It was not possible to tell apart successful attacks on small prey from unsuccessful attacks, based on
139 accelerometer output. For example, the geometric mean MA during periods of prey handling were
140 negatively related to h_a , meaning that when unsuccessful attacks produced relatively high levels of
141 MA , this had to do with the relatively lower h_a of unsuccessful attacks (Fig. 3a,b). The geometric
142 mean MA was highly correlated with average amplitude (i.e Pearson's correlation coefficient: 0.95;
143 $t=7.63$, $df = 6$, $p < 0.002$). Hence, the same conclusion was reached when using MA amplitude
144 instead of geometric mean MA as an explanatory factor.

145 It has previously been demonstrated that accelerometer tags can be applied to discriminate between
146 escape, feeding, and routine behaviour (Broell *et al.*, 2013), determine swimming speed (Thiem *et*
147 *al.*, 2015), and burrowing behaviour (Almeida *et al.*, 2013). Adding to this list, the potential of
148 quantifying handling time and prey size enables important and interesting possibilities for studying
149 predation and its consequences in aquatic systems.

150 Automated, numerical estimates of accelerometer-derived handling times (h_a) allows for swift
151 processing of large amounts of data, compared to e.g. video analyses. Estimates of h_a corresponded
152 well with observed time from attack until the pike stopped moving (h_1). The remaining part of prey
153 handling was however not detected by the accelerometer, despite high gill movement, why handling
154 time until complete swallowing of prey (h_2) was poorly estimated.

155 The ability of accelerometry to discern between successful and unsuccessful attacks is limited. Half
156 of the unsuccessful attacks in the present study lasted less than one second, consisting of missed
157 strikes. However, one successful attack also lasted less than one second, involving the smallest prey
158 (72 mm) used in the experiment. This prey was immediately swallowed. All other successful attacks
159 lasted at least eight seconds. On the opposite side one unsuccessful attack lasted more than one
160 second, as the prey was lost relatively late in the handling phase, and this attack could likewise not

161 be discriminated from the successful attacks. Failed strikes may thus be identified only in situations
162 where the available prey items are relatively large and uniform in size.

163 In the majority of published accelerometer studies, the tag was attached to fish using invasive
164 methods such as attachments through the dorsal musculature with different types of sutures or
165 plastic wires (e.g. Franklin *et al.*, 2004; Broell *et al.*, 2013; Almeida *et al.*, 2013) or implanted into
166 the abdominal cavity (e.g. Murchie *et al.*, 2011; Wright *et al.*, 2014; Landsman *et al.*, 2015). In the
167 present study, tags were attached using surgical glue. This approach brought minimal harm to the
168 fish, but the tag remained on the fish in general only 24-72 h (maximum 120h).

169 Limited data-logging capacity restricts the applicability of accelerometry to short-term
170 measurements, in spite of the acceleration-triggered data recording used here. The high correlation
171 between recordings at 100 Hz and the simulated estimates for 10 Hz, however, indicates the
172 potential for lower recording frequencies. As long as handling times are not very short (Fig. 2d),
173 recordings at 10 Hz should suffice for reliable measurements, thereby using less memory space.

174 In summary, the present study is the first to demonstrate how accelerometer technology can be used
175 to study foraging behaviour in northern pike. The study further indicated that accelerometer
176 technology can be applied to study handling times in settings where video-observation technology
177 is inadequate. In doing so, this study has expanded what is already known about the use of
178 accelerometer technology in studies of foraging behaviour in fishes (Broell *et al.*, 2013;
179 Brownscombe *et al.*, 2014; Kawabata *et al.*, 2014). Although, the method comes with limitations
180 (as discussed above), it still provides the potential for detailing studies of predation in e.g. highly
181 turbid or humic waters, as well as detailed recording of exact acceleration behaviour during prey
182 handling.

183

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Figure 1. One-dimensional magnitude of acceleration (MA). Example of a time line of MA values from a succesful attack. The first 200 second of data is presented and the dashed horizontal line represents the threshold value τ applied in the computerized extraction of handling times (h_a). In the present example h_a was 22.3 sec. The imbedded graphs show the raw accelerations g in three dimensions (g : 9.81 m sec^{-2}) before the transformation into the one dimensional vector norm.

Figure 2. Validating the accuracy of the accelerometer based handling time. (a & b) Comparing the computerized accelerometer based handling times (h_a) to the observed handling times (h_1 and h_2 , see the definitions in Methods and Materials). Data points represent individual trials; successful attacks (*black*) and unsuccessful attacks (*grey*). Solid grey lines are regression lines (a: $r^2=0.93$, $h_1 = 1.25 \times h_a + 1.97$; b: $r^2=0.87$, $h_2 = 3.13 \times h_a - 5.64$) and dashed grey lines are the associated standard errors. The dotted black line is where the points should be aligned if h_a corresponded precisely to the observed handling times (i.e. the 1:1 relationship). (c) Sensitivity to τ . For each threshold the Pearson's product moment correlation coefficient was calculated for the relationship between h_a and h_1 . (d) Comparing h_a derived at 100 Hz and 10 Hz. The dashed line is where the points should be aligned if h_a values derived from 10 Hz recordings were identical to h_a values derived from 100 Hz.

Figure 3. Comparing successful and unsuccessful attacks. (a) Density distributions of MA values from all eight trials that was executed successfully, four succesful attacks (*red*) and four unsuccessful attacks (*blue*). (b) Geometric mean MA plotted against the computerized handling time (h_a); data include both succesful attacks (*red*) and unsuccessful attacks (*blue*).