How the collection of fish length data using electronic monitoring video review measures up to current methods used on a fishery-independent survey

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Abstract

Electronic monitoring (EM) systems are tools that can generate fisheries survey data when at-sea challenges such as on-deck logistics, workload capacity, or deployment interruptions prevent staff from fulfilling their duties. We sought to validate EM's specific utility in collecting fish lengths at a comparable resolution to those collected at sea during a fishery-independent survey, the Gulf of Maine Bottom Longline Survey. We also examined whether measurement accuracy was influenced by tail morphology and length type (fork, total, and stretched total) by selecting individuals from six anatomically variable species. Individuals were measured twice: Survey-based length measurements, L_{s} , were recorded using an electronic measuring board and EM-based length measurements, L_{E} , were visually estimated using a color-coded EM measuring strip during video review. Paired Wilcoxon signed rank tests determined significant differences between the L_{S} and L_{E} distributions for all species overall, and for individual species Atlantic cod, cusk, haddock, and spiny dogfish but not thorny skate or white hake. Kolmogorov-Smirnov tests detected no difference between the distributions of L_{S} and L_{E} , overall and for each species. Examination of the differences between L_{S} and L_{E} for every individual, L_D , indicated that the EM-based method slightly over-estimated lengths ($\mu = 0.89$ mm). Linear regression indicated that the effect of extreme small or great lengths on absolute L_D was present only for Atlantic cod where L_D increased as fish length decreased. Pairwise comparisons of L_D among fish length types indicated that fork and stretched total length measurements were overestimated by the EM-based method ($\mu = 2.39$ mm, 3.09 mm, respectively) and this was significantly more than total length ($\mu = 0.04$ mm). We demonstrated that collection of fish lengths using video review could be an adequate substitution for collecting lengths by hand, though it is at the discretion of the end users to determine whether these length differences exceed the acceptable range. These results have particular applications to small scale survey operations, research, and the fishery-dependent sector.

Keywords: fisheries management, Gulf of Maine, fish morphology, subsample analyses

Introduction

Over the last two decades, electronic monitoring (EM) systems have been increasingly implemented in worldwide fishery-dependent data collection and fisheries management (van Helmond *et al.*, 2020). These systems tend to consist of a central control unit, GPS, mechanical sensors, and video cameras that record footage of fishing activity (McElderry, 2008). The resulting video can be reviewed to collect fishery-dependent data, supplementing or replacing on-board observers. EM systems may be

preferable to on-board observers when a vessel's size or configuration is not suited to host an additional person, when there is a need for simultaneous viewing of multiple angles of activity, or when observation periods extend beyond reasonable human capabilities. EM systems are also deployed to validate fishing location and duration, identify protected species interactions, and document regulatory compliance.

Fishery-independent surveys present a unique platform for experimental testing, but challenges around increased staff workload or staff deployment exist. Camera systems can solve these problems by generating a means of postsurvey data collection, and they have been successfully deployed alongside traditional fisheries survey gear (Starr *et al.*, 2016; Williams *et al.*, 2016; Stokesbury *et al.*, 2017; Miller *et al.*, 2019; Lee *et al.*, 2022; Nelson *et al.*, 2024). The crossover applications between survey and industrybased operations include exploration of technological limits, validation of new applications, and compilation of annotated video or photographic data for advanced machine learning and automated video processing.

The Gulf of Maine Bottom Longline Survey (BLLS) is a twice yearly, cooperative groundfish survey conducted on contracted commercial fishing vessels by the U.S. Northeast Fisheries Science Center (NEFSC). Beginning in 2020, camera systems were deployed on the vessels to test their potential utility in survey research activities (Nelson et al., 2024). The present study seeks to validate the use of EM as a method for collecting fish lengths that are comparable to lengths collected via more traditional methods used on fisheries-independent surveys. Similar validation studies have been conducted in the Taiwanese longline albacore tuna fishery (Chang et al., 2010), Welsh lobster and brown crab fisheries (Hold et al., 2015), the Pacific halibut longline fishery (Wallace et al., 2015), and Solomon Islands longline fisheries (Hosken et al., 2016). Here, lengths were recorded twice from individuals of six anatomically variable groundfish species according to their specified measuring methods: the first measurement using at-sea data collection protocols and the second using EM protocols. The resulting measurement distributions were compared and the calculated differences between each measurement method were further examined.

Materials and Methods

Fish Measurement Data Collection

Field surveys were conducted in accordance with survey protocols (McElroy *et al.*, 2019) on the contracted partner vessel F/V *Mary Elizabeth*. The vessel crew members were responsible for setting and retrieving the longline gear and the NEFSC survey staff collected catch and biological information. The AI Hub and SnapIT camera system were provided and installed by the electronic monitoring service provider Teem Fish Monitoring¹ of Prince Rupert, British Columbia, Canada. A camera with 720p high definition resolution (1920x1080) and a frame rate of 30 frames per second was mounted underneath the deck overhang and aimed directly down and over the processing table. Video of catch processing was continuously recorded onto a hard drive throughout each trip. Following completion of the survey, video was processed, uploaded to cloud storage, and viewed using the proprietary software provided by Teem Fish Monitoring.

Fish length data collected during the survey, hereby referred to as L_{s} , were recorded to the nearest millimetre with the Ichthystick II Electronic Fish Measuring Board (Price et al., 2015). The board consists of an electronic measuring stick with visible tick marks housed in a rectangular plastic case and backstop at the 0 centimetre mark (Fig. 1). When calibrated properly, the accuracy of the Ichthystick II is ± 0.1 centimetres with a slight negative bias. Fish were laid on the measuring board as flat as possible with the snout against the backstop. Measurements were taken by tapping a magnetic wand onto the plastic housing at the desired measurement location. Measurements were automatically saved into a tablet-based data collection application. Lengths collected using EM protocols, hereby referred to as L_E , were collected using a color-coded EM measuring strip overlaid on the electronic measuring board, also provided by Teem Fish Monitoring. Post-survey video review and collection of L_E was conducted by a NEFSC staff member. When a candidate fish was held steady on the measuring board, the video was paused and fish lengths were visually determined by the reviewer using the EM measuring strip markings, consistent with the NEFSC Northeast Fisheries Monitoring Operations Branch guidance (Pers. Comm. Corinne Endres). To reduce bias, the moment in the video when L_E was collected may not have been the exact moment when L_S was collected. The design of this length strip consisted of colored markings in 1-centimetre increments (Fig. 1). The length of 0.01-1.00 centimetres



Fig. 1. Top: Electronic monitoring camera view of the catch processing area, including electronic measuring board with backstop, tablet, and the electronic monitoring length strip. Bottom: a haddock laid on the measuring board prior to recording the length using the magnetic wand. The EM reviewer would record this individual's fork length as 54 centimetres (note: this individual is not part of the dataset).

¹ Reference to any specific commercial product, process, or service, or the use of any trade, firm or corporation name is for descriptive purposes only, and does not constitute endorsement, recommendation, or favoring by NOAA Fisheries.

was recorded as 1 centimetre, 1.01–2.00 centimetres was recorded as 2 centimetres, etc.; therefore, fish lengths were recorded as whole centimetres. Marking color aided in quick assessment of length: white markings were odd values, black markings were even values, and red markings were every 10 centimetres. Records of L_s and L_E as well as station data were merged into one dataset in R Studio version 1.4.1106 (R Core Team 2021, RStudio Team 2021). L_E were converted from centimetres to millimetres for direct comparison to L_s and reduced by 5 mm. This reduction shifts L_E records around the center of each 1 cm marking and conforms to traditional rounding convention. For example, a fish that fell on a black bar between 41.01 and 42.00 cm was initially recorded as 42 cm, then converted to 420 mm and reduced to 415 mm. L_{S} are the reference measurements and were not adjusted in any way.

We also examined whether morphology and length type impacted the accuracy between L_S and L_E . To do this, we selected the following six fish species with diverse tail morphologies that are also well represented in the BLLS: Atlantic cod (Gadus morhua), cusk (Brosme brosme), spiny dogfish (Squalus acanthias), haddock (Melanogrammus aeglefinus), white hake (Urophycis tenuis), and thorny skate (Amblyraja radiata). The length type used for each species is based on the NEFSC bottom trawl survey's protocols. Total length, recorded as the measurement from tip of the snout to the tip of the tail, was recorded for species with rounded tails (Atlantic cod, cusk, and white hake) or pointed tails (thorny skates). Fork length, recorded as the measurement from tip of the snout to the deepest part of the tail fork, was recorded for the only species with a slightly concave tail (haddock). Finally, stretched total length, recorded as the measurement from tip of the snout to tip of the upper tail lobe when the tail was stretched down and in line with the body midline, was recorded for the only species with a forked tail with asymmetric lobes (spiny dogfish).

Identifying subset of stations and individuals

The dataset included individuals from three sampling periods: spring (April-May) 2021 and 2022, and autumn (October–November) 2021. L_S was recorded for all catch encountered on the survey, but recording a census L_E from all individuals of the chosen species would have been very time consuming. Therefore, for the purposes of this study and for each species, a representative subsample of individuals from the BLLS population was identified. We estimated the target subsample size for each species using two methods. First, the R package "samplingbook" version 1.2.4 (Manitz et al., 2021) was used to estimate subsample sizes with the same mean length $\pm 5\%$, standard deviation, and a 95% confidence interval as the BLLS population. Second, Kolmogorov-Smirnov (K-S) tests determined the minimum subsample size needed to produce a similar distribution to the BLLS population (Marsaglia et al., 2003). To determine the appropriate sample size, a simulation of fish length resampling without replacement from the BLLS population was conducted for subsample sizes from 10 to 100 by intervals of 10 and a K-S test was conducted on each subsample by calling the ks.test command from the package "stats" version 4.2.2. This process was repeated for 1,000 iterations and the resulting plots of K-S test p-values were used to visually determine a target subsample size (Supplementary Material S1). The smallest subsample size per species in which the p-values of all 1,000 iterations was above 0.05 was selected as the minimum subsample size. The plots for the three most abundant species (cusk, spiny dogfish, and haddock) did not indicate any differentiation among subsample sizes, so sample sizes of 50 were arbitrarily selected for the K-S method. The greater of the two subsample estimation methods was selected as a minimum subsample size target for each species (Atlantic cod = 72, cusk = 50, haddock = 50, spiny dogfish = 50, thorny skate = 87, and white hake = 50; Supplementary Material S2).

Next, we identified a subset of candidate stations from which to measure all available individuals of the interest species. From the initial 69 stations across the three survey cruises, only 64 of those had length data available at the time of the data pull. We eliminated four stations where the video was available (i.e. not missing due to power failure or system malfunction), 4 stations where the length strip was missing from the measuring board, and one station where the length strip was improperly placed. For each distinct species, the remaining 55 candidate stations were further reduced according to species specific length thresholds in order to avoid cluster sampling of the most common lengths. Each available station must have at least one representative below the lower length threshold or above the higher length threshold (Supplementary Material S2, S3). The thresholds for Atlantic cod, cusk, spiny dogfish, and white hake were the median length $\pm 50\%$, while the threshold for thorny skate was the median length $\pm 20\%$, due to its non-normal length distribution. The stations were finally narrowed according to a minimum and/ or maximum number of individuals measured at that station. These limits were different for each species and dependent on whether the species was typically caught as schools or as incidental individuals. Prioritizing stations with the greatest number of individuals increased our data collection efficiency. The resulting candidate stations were visually assessed and selected such that the full lengthrange of each species was represented and the minimum subsample size was achieved.

Analysis

Analyses comparing the L_s and L_E distributions were conducted for all species combined and each species separately. The first comparison was the Wilcoxon signed rank test, a non-parametric test of equal means between paired samples which does not assume equal variance, by calling the *wilcox.test* command and specifying *paired* = T from the R package "stats" version 4.2.2 (Wilcoxon, 1945; Bauer, 1972). The second comparison were K-S tests as described previously. Mathematical differences between the survey and EM data collection methods, hereby

referred to as L_D , were calculated for each individual where $L_D = L_E - L_S$. This value evaluates whether the EM method over- or under-estimated length measurements (positive or negative L_D values, respectively). Records with $L_D \ge \pm 10$ millimetres were reevaluated in video review, taking care



Fig. 2. Frequency distribution of length measurements, binned at 10 mm for clarity, collected from the survey Ichthystick II fish boards (L_S : black striped fill) or from electronic monitoring video review (L_E : solid gray). Above the histograms, the filled circle and line segments represent the median length and inter-quartile ranges of each distribution (L_S : black dashed line, L_E : solid gray line). Frequencies are displayed for all species combined (top) and for each species individually. Fish images downloaded from the [©]NOAA fisheries website (<u>fisheries.noaa.gov/species</u>), thorny skate illustration by Lindsay Gutteridge, downloaded from the Florida Museum (<u>floridamuseum.ufl.edu/science/thorny-skates/</u>).

to note circumstances surrounding their measurement and possible sources of error such as measuring incorrect individuals, fish handling, fish condition, EM measuring strip position, and view obstructions. From these records, there were two instances where the EM measuring strip had shifted away from the measuring board backstop, creating offsets of 10 and 40 millimetres. The L_E for these records were corrected by adding the number of millimetres associated with the specific offset. An additional test to determine whether absolute L_D values correlated with fish length or whether any species was prone to increased L_D was conducted by calling the lmcommand from the R package "stats" version 4.2.2, where absolute L_D was predicted as a function of L_S . Finally, comparisons of mean L_D among length types (fork, total, stretched total) were made using t-tests.

Results

A total of 388 fish were included in the dataset. For each species, the number of individuals (n), the length

range, and mean length (μ) were as follows: Atlantic cod (n = 74, 246–759 mm, $\mu = 480.28$ mm), cusk (n = 55, 321–746 mm, $\mu = 514.26$ mm), haddock (n = 56, 269–628 mm, $\mu = 444.04$ mm), spiny dogfish (n = 65, 443–919 mm, $\mu = 739.75$ mm), thorny skate (n = 84, 382–959 mm, $\mu = 537.39$ mm), and white hake (n = 54, 356–888 mm, $\mu = 618.50$ mm). For all species collectively, differences between the L_s and L_E distributions were detected by the paired Wilcoxon test ($\mu = 554.94$ mm and 560.82 mm, respectively; p < 0.001) but not the K-S test (Fig. 2, Table 1). When comparing L_s and L_E for each species, the paired Wilcoxon test detected differences for Atlantic cod, cusk, haddock, and spiny dogfish (p < 0.001) but again, the K-S tests did not detect any statistical differences between the distributions.

The mean L_D values provided evidence for length overestimation by the EM measurement method for Atlantic cod, haddock, and spiny dogfish, and evidence for under-estimation for cusk, thorny skate, and white hake (Fig. 3, Table 1). Regardless of the direction, these values

Table 1. Summary of statistical tests between length measurement distributions collected from the survey (L_s) and electronic monitoring video review (L_E) . Rows indicate all species combined and individually; n = number of measured individuals; Wilcoxon signed rank test statistics where V = test value, bold if $p \le 0.05$; Kolmogorov-Smirnov (K-S) test statistics, where D = test statistic; Summary of the mathematical differences between L_s and $L_E (L_D)$, where min = minimum, $\mu =$ mean, max = maximum, and SD = standard deviation; Linear Reg. = Linear regression testing absolute value of L_D as a response to L_s , where β = slope coefficient, bold if $p \le 0.05$).

Species	п	Wilcoxon-test	K-S test		L_{D} (Linear Reg.		
				min	μ	max	SD	
All Species	388	V = 39063	D = 0.039	-24	0.89	25	5.90	$\beta = 0.0003$
		<i>p</i> < 0.001	p = 0.934					p = 0.814
Atlantic cod	74	V = 1995	<i>D</i> = 0.068	-21	2.28	20	5.79	$\beta = -0.013$
		<i>p</i> < 0.001	<i>p</i> = 0.993					p = 0.003
Cusk	55	<i>V</i> = 259	<i>D</i> = 0.073	-10	-1.98	13	4.37	$\beta = 0.004$
		<i>p</i> < 0.001	<i>p</i> = 0.997					p = 0.297
Haddock	56	V = 1159	<i>D</i> = 0.125	-19	2.39	12	4.91	$\beta = 0.005$
		<i>p</i> < 0.001	<i>p</i> = 0.736					<i>p</i> = 0.442
Spiny dogfish	65	V = 1656	D = 0.077	-17	3.09	20	5.69	$\beta = 0.011$
		<i>p</i> < 0.001	<i>p</i> = 0.987					<i>p</i> = 0.113
Thorny skate	84	V = 1391	D = 0.060	-24	-0.49	25	7.48	$\beta = 0.004$
		<i>p</i> = 0.356	<i>p</i> = 0.999					<i>p</i> = 0.371
White hake	54	V = 492	D = 0.056	-8	-0.17	8	3.55	$\beta = 0.003$
		<i>p</i> = 0.776	<i>p</i> = 1.000					p = 0.276

were very small (-1.98–3.09 mm, overall $\mu = 0.89$ mm). White hake had the lowest L_D range and standard deviation (-8–8 mm, 3.55 mm, respectively) and thorny skate had the greatest L_D range and standard deviation (-24–25 mm, 7.48 mm, respectively), the latter indicated both a greater frequency and magnitude of non-zero L_D . Linear regression did not detect a significant relationship between L_S and absolute value of L_D for all fish collectively, meaning that in general, individuals of extreme small or large lengths are not prone to increased absolute value of L_D . Of the individual species, only Atlantic cod exhibited a significant trend, where absolute value L_D was highest at small lengths and decreases with increasing fish length ($\beta = -0.013$, p = 0.003).

Among the three length types, total length had near-zero mean L_D and the highest standard deviation (Fig. 4, Table 2). Fork length and stretched total length had comparatively



Fig. 3. Dot plot of the length measurements collected from the survey Ichthystick II fish boards (L_S) versus the electronic monitoring video review (L_E) for each individual. Colours and shapes indicate when L_E was over estimated (teal squares), under estimated (orange triangles), or equally estimated (white circles) relative to L_S . Inset plots illustrate frequency of L_D values with corresponding over, under, and equally estimated colors, and mean L_D value (dashed line).

Table 2. Summary statistics of the differences between length measurements collected from the survey and electronic monitoring video review (L_D) among the three length types: n = number of individuals; min = minimum, $\mu =$ mean, max = maximum, SD = standard deviation. The pairwise t-test *t*-statistics are below the diagonal, *p*-values are above diagonal, bold if $p \le 0.05$.

Length Type	n	L_D (mm)				Pairwise T-test			
		min	μ	max	SD	Fork	Stretched Total	Total	
Fork	56	-19	2.39	12	4.91	-	0.469	0.002	
Stretched Total	65	-17	3.09	20	5.69	-0.726	-	< 0.001	
Total	267	-24	0.04	25	5.95	3.139	3.846	-	



Fig. 4. Frequency plot and mean (orange dashed line) of the differences (L_D) between length measurements collected from the survey and electronic monitoring video review among the three length types.

higher mean L_D , and lower standard deviations. Pairwise comparisons indicated that the differences in mean L_D were significantly different between total and both fork and stretched total length (p = 0.002, p < 0.001, respectively) and that there was no difference between the mean L_D of the latter two (p = 0.469). Because both fork and stretched total length were comprised of a single species and total length was comprised of four species the resulting uneven sample sizes among the measurement methods may have introduced bias in the calculations.

Discussion

This study successfully demonstrated that EM systems and associated video analysis can be used as a tool to collect fish lengths at an accuracy comparable to the lengths collected by fishery-independent longline survey staff. Depending on the test used, the distributions of L_s and L_E may be statistically different from each other. Disparities were most evident when examining L_D , the mathematical differences between L_s and L_E . The EM method over-estimated lengths for half of our species and under-estimated for the other half. Although some of these distributions were statistically different, the effect on downstream BLLS data end users would be minimal in practice. However, this may not be the case for other data collectors and users, and the precision of the data should be considered in the context of individual programs.

The primary source of non-zero L_D stems from the study design itself. Comparing measurements from two units of measure (centimetres vs millimetres) inherently loses precision and the chances that the reading of one 1-cm mark matches the reading from the 1-mm unit board is not common. A second source of non-zero L_D stemmed from fish handling and positioning on the EM measuring strip. Despite best efforts to lay fish flat, lively individuals defensively and evasively curled or twisted themselves. A change in the position or configuration of an individual between the times when lengths were recorded on the BLLS and recorded from the video could have affected measurement accuracy. For example, second review of the video for the greatest L_D record for Atlantic cod (-21 mm) revealed that the fish curled its tail upward, towards the camera, though at first glance, it appeared to be resting flat. To mitigate this source of increased L_D , the EM reviewer must not rush data collection and ensure the fish is truly laid flat. A third source of non-zero L_D was the improper alignment of the EM measuring strip on top of the electronic measuring board and against the backstop. This occurred for two records of thorny skate, as noted prior. In the event the EM measuring strip becomes offset for an entire haul or basket of fish, a batch of consistently negative L_D would be evident and should be regularly checked for in data quality procedures. To mediate improper alignment between the EM measuring strip and the backstop we recommend using a fixed or permanently integrated EM measuring strip.

It is important that studies using EM should consider two potential sources of non-zero L_D that were not directly

observed here. The first is the distortion of the measuring strip at the edges of the camera view. In the current study, the camera was centered over the measuring board backstop and the lower range of measurement values. As the EM measuring strip extended away from the center of the camera view, the 1-centimetre wide markings narrowed, and this distortion presents an opportunity to introduce uncertainty. To minimize this, efforts should be made to center the camera over the EM measuring strip and install the camera at a distance from the EM measuring strip that would reduce image distortion. A second source of potential L_D may be in the accuracy of the measurement tools. The level of error for the Ichthystick II boards is low $(\pm 0.1 \text{ cm})$ and well within the nearest whole or half centimetre data standards required by most of the U.S. Northeast region stock assessments (Grosslein, 1969; Wigley et al., 2003; Price et al., 2015). The standard deviations of L_D reported here also fall within the whole centimetre data standard, which support the idea that lengths collected by EM systems could be a valid component of stock assessments. The design of the particular EM measuring strip is also important to note. Providers of EM systems supply their own independently designed measuring strips for regulatory compliance. The measuring strip and subsequent initial measuring method in this study did not conform to traditional rounding standards, thus necessitated shifting L_E by 5 mm. Proper rounding is a critical component to estimating abundance of year classes or when dealing with harvest size limits. The accuracy of EM-collected lengths using alternative EM measuring strip designs should be tested for by conducting studies in a similar manner to the present one.

We detected differences in measurement accuracy among fish length types. Morphological diversity prevents a single length type from being used for all species, but standardized measures based on shared morphology are commonly used (Francis, 2006). These standardized measures can be of varying reproducibility success and therefore potentially introduce variability into L_{D} . For example, a study of three freshwater species found lower mean and standard deviation for fork length and total length compared to "standard length", a length type that has a history of inconsistent definition, for three freshwater fish species (Carlander and Smith Jr., 1945). Furthermore, fork length may be more easily reproducible than standard length or total length, though the difference in accuracy is marginal (Kahn et al., 2004). Although the handling of fish while collecting fork length and total length in the BLLS are similar (*i.e.* no manipulation of tail placement), the distributions of L_D were statistically different between them. The greater variance seen in total length in this study may be driven by the data from thorny skates, which have the highest variance of all examined species. It was expected that stretched total length would have the highest variance because the extent to which the anterior tail lobe is stretched by the handler to the center of the measuring board may not be consistent. In addition, spiny dogfish

are notoriously lively and their bending and flexing could create measurement inconsistencies that are independent of the stretched length methodology. The results among length types may have been further influenced by unequal sample sizes, which could be clarified by conducting the study again with equal number of fish per length type or with the inclusion of other species with slight morphological differences.

This study was performed by collecting one L_E per fish by a single video reviewer. Although between-reviewer variability is routinely assessed when estimating fish ages (Campana et al., 1995; Buckmeier, 2002), few such comparisons exist for morphological measurements (Petrtýl et al., 2014). Additional investigation of between-reviewer variability would provide insight into the feasibility and caveats of collecting length data using EM, expansion towards team-oriented data collection, development of data collection protocols, and conducting routine between-reader tests. Further, it is important to note that EM video reviewers should follow fish measuring protocols according to guidelines set by data users, thereby minimizing measurement variation among datasets and the time spent creating protocols or adjustment factors.

The current study demonstrated how camera system utilization can increase the volume of scientific data and expand survey operations. The camera system and length strip equipment simplify fish length measurement collection process such that proper placement and handling of the fish in front of the camera can be performed by a single person with minimal training. In addition, a durable length strip and post-survey data collection eliminates the onus of collecting or transcribing data by hand, maintaining water sensitive cables and costly tablets, and troubleshooting Bluetooth connectivity issues, as are encountered on the BLLS. These benefits are particularly applicable to small or industry vessels, where installation of EM systems or recruitment of those with existing systems can open doors for collaborative projects with government agencies and academic institutions (Sigler and Lunsford, 2009; McElroy et al., 2019). Such collaborative efforts have gained support in recent years. For example, offshore wind development in the United States Northeast region will impact existing federally based surveys (Methratta et al., 2023), and smaller industry based surveys are being looked to as alternatives. Similarly, the Gulf of Maine shrimp fishery participants are responding to federal funding cuts to the current sampling program by mobilizing self-funded and operated sampling efforts, part of which involves EM camera equipment (Molyneaux, 2024). The benefits of using EM to collect fish lengths is less applicable to mature, large scale fishery-independent surveys. In these survey operations, collection of fish lengths is a regular task that can account for a large proportion of catch processing (Link et al., 2008) and replacing wellestablished, systematic methods with video-based and post-survey methods is unlikely to improve efficiency. However, EM could be a viable backup option in the event of scientific staffing shortages or increased reliance on vessel crew to collect data. There is also application of this work in the fishery-dependent sector. EM review could serve as an oversight tool where catch is sorted into market categories or product types based on fish length, such as at processing plants or on catcher-processor vessels. It could also be an effective way to collect lengths at any size range, expanding its use from discards to retained catch lengths. This last point is particularly useful as funding for port samplers or on-board observers is reduced or not keeping pace with the required cost.

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