# Recovery of critically endangered Nassau grouper (Epinephelus striatus) in the Cayman Islands following targeted conservation actions 

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#### Abstract

Many large-bodied marine fishes that form spawning aggregations, such as the Nassau grouper (Epinephelus striatus), have suffered regional overfishing due to exploitation during spawning. In response, marine resource managers in many locations have established marine protected areas or seasonal closures to recover these overfished stocks. The challenge in assessing management effectiveness lies largely in the development of accurate estimates to track stock size through time. For the past 15 y , the Cayman Islands government has taken a series of management actions aimed at recovering collapsed stocks of Nassau grouper. Importantly, the government also partnered with academic and nonprofit organizations to establish a research and monitoring program (Grouper Moon) aimed at documenting the impacts of conservation action. Here, we develop an integrated population model of 2 Cayman Nassau grouper stocks based on both diver-collected mark-resight observations and video censuses. Using both data types across multiple years, we fit parameters for a state-space model for population growth. We show that over the last 15 y the Nassau grouper population on Little Cayman has more than tripled in response to conservation efforts. Census data from Cayman Brac, while more sparse, show a similar pattern. These findings demonstrate that spatial and seasonal closures aimed at rebuilding aggregationbased fisheries can foster conservation success.


fish-spawning aggregation | Nassau grouper | integrated population model | mark-resight | tagging

Reef fishes that form fish-spawning aggregations (FSAs), including many species of grouper, are at high risk of being overfished when fisheries target their FSAs (1-6). Heavy fishing pressure at FSAs can impact the targeted population in a number of ways, from decreasing mean length and skewing sex ratios for hermaphroditic species, to complete collapse and disappearance of the FSA (1, 7-11). Such overfishing is often masked by hyperstability, whereby catch-per-unit effort (CPUE) at the FSA remains high despite steep population declines (12-16); as a result, the onset and persistence of fisheries-induced population decline is poorly detected. The vulnerability of FSAs to fishing, coupled with poor catch-based indicators of overfishing, has resulted in pervasive overfishing of coral reef FSAs globally (4).

The Nassau grouper (Epinephelus striatus), once the most important reef fishery in the Caribbean, exemplifies the risks associated with FSA fishing (17). Following dramatic population declines throughout its range (Bermuda, Florida, and throughout the Caribbean), the Nassau grouper was listed as both "critically endangered" under the International Union for Conservation of Nature Red List process (18) and, more recently, "threatened" under the US Endangered Species Act (19). Nassau grouper form large FSAs at highly predictable times and locations throughout its range in the tropical Western Atlantic, Caribbean, and Gulf of Mexico (3, 9). Fish typically spend a week
or more at FSAs, ultimately releasing gametes over the course of a few nights. Eggs are externally fertilized, with at least one female and multiple males participating in spawning events (20). The fertilized eggs hatch after $\sim 24 \mathrm{~h}(9)$ and remain as pelagic larvae for 35 to $45 \mathrm{~d}(21,22)$. Larvae do not necessarily recruit to the locations in which they were spawned; population genetic studies show broad (but not complete) connectivity across the Caribbean (23, 24). Following recruitment, individuals take 5 to 7 y to reach reproductive maturity and may live 29 or more years (8). Because the total annual reproductive output for a stock happens over a short window of time and a single location, it is reasonable to expect high variability in recruitment $(25,26)$.

The spatiotemporal predictability of Nassau grouper FSAs makes them particularly susceptible to overfishing during the spawning season (2). Historically, some Nassau grouper FSAs may have hosted upwards of 100,000 individuals (27), attracting fish from as much as 260 km away $(28,29)$. Records from Cuba suggest that annual Nassau grouper catch, at its maximum in the

## Significance

Overfishing of tropical grouper- and snapper-spawning aggregations is a globally pervasive problem, but evidence is elusive that recovery can occur following stock collapse. We analyze a uniquely rich research and monitoring dataset from spawning aggregations in the Cayman Islands to reconstruct annual Nassau grouper spawner abundance across almost 2 decades of postcollapse adaptive-fisheries management. Using an integrated population model that leverages both markresight and video census techniques, we demonstrate that Nassau grouper have undergone a remarkable recovery during this time frame. Because of the implementation of these deliberate, science-based conservation strategies, Little Cayman is now home to the largest remaining identified Nassau grouper aggregation anywhere in the world.

[^0]1960s, reached $1,800 \mathrm{t}$, although subsequent decades showed steady declines until collapse by the 1990s (30). While the Cuban example is unusually well documented, the fate of Cuban Nassau grouper populations has been repeated throughout the range of the species. Once FSAs are discovered, they are fished intensively; many such aggregations have ultimately been fished to the point where fish cease to aggregate (31-34). In a contemporary context, few of the known remaining FSAs host more than 1,000 individuals $(2,5,35,36)$.
Following regional collapses in Nassau grouper FSAs, many nations have sought to protect their remnant populations through a variety of management actions, including fishing moratoria, seasonal closures, or the establishment of marine protected areas at FSAs (8, 22, 37-41). To date, few published studies have quantitatively demonstrated the efficacy of such management strategies even after several decades of aggressive management (e.g., complete fishing moratoria). It is not clear if this lack of evidence stems from management ineffectiveness (e.g., enforcement/compliance failures), population processes, e.g., Allee effects (3, 42, 43), recruitment variability $(44,45)$, or an absence of data sufficient to document success.
Like many Caribbean nations, the Cayman Islands (Fig. 1A) have a long history of Nassau grouper exploitation and a more recent history of overexploitation (see SI Appendix, Supplement $A$, Table S 1 for a Cayman Island Nassau grouper fishery history). Following concerns of decreased catch voiced by Caymanian fishermen in the 1980s, the Cayman Islands Department of Environment (CI-DoE) began collecting catch data during the spawning season and carried out age and growth studies for the species in 1987 (8). These early efforts at monitoring fishing were abandoned by the late 1990s as catch across all 3 Cayman Islands had completely collapsed. In 2001, however, a Nassau grouper FSA was discovered by 2 local fishermen at the west end of Little Cayman, opposite the historical location at the east end of the island (Fig. 1B). At the time of discovery, the FSA consisted of $\sim 7,000$ fish; in 2 y of fishing, the CI-DoE recorded at least 4,000 Nassau grouper caught (excluding undocumented take that was likely substantial) (8, 20). In 2003, the Cayman Islands Marine Conservation Board responded to this rapid decline by instituting no-take zones on all known (historical and active) Nassau grouper FSAs during the spawning season. Subsequently, in 2016, the Cayman Islands government enacted legislation aimed at recovering Nassau grouper (46). The 2016 regulations include
a seasonal closure on Nassau grouper harvest from December through April inclusive (possession, sale, and take of Nassau grouper during this time is illegal); a 16- to 24 -inch slot size limit; a bag limit of 5 Nassau grouper per vessel per day during the open season; and gear restrictions (no take of Nassau grouper via spear). Additionally, the Cayman Islands maintain a range of marine parks, some of which are no-take year-round; during this study, no-take zones covered $\sim 15 \%$ of the Cayman Islands shelf area (increasing to $45 \%$ in March of 2019).

Since the discovery of the west-end Little Cayman FSA, Reef Environmental Education Foundation (REEF) and the CI-DoE have monitored Nassau grouper FSAs in the Cayman Islands through the collaborative Grouper Moon Project. The Grouper Moon Project aims to provide the Cayman Islands government with monitoring data necessary to effectively assess and manage Nassau grouper populations. While prior to fishery collapse, the CI-DoE collected CPUE data from aggregation-based fisheries (8), FSA closures precluded the continuation of these data. That, and because hyperstability tempers the value of such data for assessments, we developed and implemented a long-term (15+ year) diving-based census program to estimate fish abundance at FSAs in the Cayman Islands. For the purposes of this study, we assumed that the abundance of spawners at the FSAs on each island provide a direct proxy for the total spawning stock of Nassau grouper on that island. Thus, a time series of estimates of spawners on each island reflects the stock-level response of Nassau grouper to the abovementioned management efforts. We revisit and justify this assumption in Discussion.
Here, we provide evidence for the recovery of Little Cayman and Cayman Brac Nassau grouper populations over the last decade, based on data generated from both a mark-resight program and video census techniques $(47,48)$. Specifically, we report on an in situ mark-resight technique that uses external tags (Floy tags) deployed with pole spears and subsequent visual counts of marked and unmarked individuals by research divers (surveyors). Using these counts, we generate estimates of the number of spawning adults and, importantly, provide confidence intervals associated with these counts. Taking account of time, we develop an autoregressive state-space model of Nassau grouper populations on both islands and inform year-specific population estimates using mark-resighting observations. Additionally, we extend this state-space formulation into an integrated


Fig. 1. Map showing location of the Cayman Islands in the greater Caribbean region ( $A$ ) and close-up of the islands of Little Cayman and Cayman Brac ( $B$ ). The close-up map shows the historical site on the east end of Little Cayman (circle) and active spawning sites on the west end of Little Cayman and the east end of Cayman Brac (triangles). The islands of Little Cayman and Cayman Brac are 10 km apart. The spawning site at Little Cayman is at a shelf break at 30 m , dropping off to $>100 \mathrm{~m}$, and the Cayman Brac site is at a gentle slope starting at 40 m , dropping to $>100 \mathrm{~m}$. In 2017, the human population of the Cayman Islands was 63,415 , with around 200 on Little Cayman and just over 2,000 on Cayman Brac (85).
population model framework (49) by combining both markresighting observations and counts from video census conducted on both FSAs over the last decade. In doing so, we demonstrate how readily available observation technologies can be incorporated into a single robust population assessment that explicitly models the process of population recovery.

## Methods

We carried out all mark-resight and video censuses at Nassau grouper FSAs on the west end of Little Cayman and the east end of Cayman Brac, in the Cayman Islands (Fig. 1B), during the winter spawning periods from 2005 through 2018. Research activities took place on the island of Cayman Brac less frequently than on Little Cayman (Table 1), as the conditions on Cayman Brac are variable and typically unsafe for diving. Conditions at the only known remaining Nassau grouper FSA on Grand Cayman (east end) precluded the research methods we outline below. However, divers made an in situ visual estimate of the number of aggregating fish in 2012, and in 2018, we estimated the size of the FSA using a remotely operated vehicle.
To tag Nassau grouper at the FSA sites, researchers on scuba deployed Floy FIM-96 Small Billfish tags using modified pole spears. Individuals were tagged opportunistically on either side of the body but always toward the back of the fish and immediately below the dorsal fin. The tag color was changed year-toyear as some tags remained on individuals for up to 3 y . In subsequent resight surveys (described below), we only recorded resightings of tags deployed in the same year to avoid issues with interannual tag loss. For the purposes of this study, we assume that tags stay on for a minimum of 8 d and thus our resightings were unaffected by short-term tag loss; we found no evidence to suggest tag shedding was occurring at the aggregation site. In all years, we concentrated tagging efforts over multiple days (usually 2 to 3 ) early in the spawning period. Typically, the FSA persists for at least 6 d after the full moon. We tagged a variable number of fish each year between 2008 and 2018 (Table 1), with the goal of tagging ~100 fish per year on Little Cayman and 30 fish per year on Cayman Brac. We chose these tagging targets to balance the potential negative impacts of tagging with the need for consistent markresightings. In later years of the study when the populations were apparently larger, we increased our resightings survey effort (rather than tagging effort) in order to maintain or increase accuracy in population-size estimates (Table 1).

Following the completion of tagging, surveyors conducted resight surveys for 2 to $6 d$ each year following a set protocol (50). While diving on the aggregation site, surveyors pseudorandomly identified 50 consecutive individuals (where they could clearly and fully see the tagging area on each individual fish) and recorded a mark-resight only when the individual fish
was tagged on the side closest to the surveyor. A survey consists of the count of tags (resights) seen from 50 fish. Surveyors typically achieved 5 to 20 surveys per dive (Table 1). In general, observers conducted surveys while swimming against the movement of fish in an effort to avoid doublecounting individual fish within a count of 50 . Because a fish could be tagged on either the right or left side, and because both sides of the same fish are not always observable, observers effectively counted 50 "sides" of fish and recorded the number of those sides that were tagged. Even if surveyors could see both sides of fish, they only counted the side closest to them, because the 2 sides of a single fish are nonindependent (fish were only tagged once). In our analysis, we excluded resighting data from any surveyor who completed 5 or fewer surveys during the entire study period (2008 to 2018).

We opportunistically collected video censuses (SI Appendix, Supplement B) of the FSAs on both islands when fish schooled into a loosely organized band along the shelf edge of the aggregation sites (20). To collect a video census, a diver started recording video at one end of the band and traversed the length of the band while keeping aggregating fish within the camera frame. When divers collected multiple video censuses within a given spawning season, the research team did preliminary counts of fish in the video to select the census that they judged to capture the most fish. Subsequently, multiple researchers and trained volunteers counted the number of fish captured during video census. The videos were typically enumerated by advancing the video slowly while continuously counting fish, advancing across paused frames and counting fish in still images, or some combination of these methods. The observers were not given a specific time interval to complete the counts in each video; rather, we instructed analysts to generate the most accurate count possible using methods that worked best for them and a time interval that would afford completion using that method. In any given video, issues of fish occlusion due to stacking, low light, and image resolution resulted in variable counts across observers. For these reasons, we collected at least 10 counts from each video in order to adequately capture count variability. The analytic framework outlined below explicitly models this observation error.

Basic State-Space Model. We modeled the true number of fish at the aggregation site each year, $N_{y}$, in $\log$ space using a state-space model, with the following state process:

$$
\begin{equation*}
\log \left(N_{y+1}\right)=\log \left(N_{y}\right)+\mu_{y}, \tag{1}
\end{equation*}
$$

where $\mu_{y}$ represents the population growth rate in year $y$ (in log space). We treated yearly population growth, $\mu_{y}$, terms as random effects drawn from a normal distribution with a mean $\bar{\mu}$ (the model-estimated overall population mean

Table 1. Number of fish tagged, the number of surveys conducted by research divers, the number of research divers (surveyors) participating, the average number of surveys conducted per dive per surveyor, and the number of video census counts completed each year on Little Cayman and Cayman Brac

Surveyors Surveys Surveys per dive per Video
Year Fish tagged, no. participating, no. completed, no. surveyor, average no. counts, no.

| Little Cayman |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 2005 | - | - | - | - | 10 |
| 2006 | - | - | - | - | 5 |
| 2008 | 36 | 4 | 42 | 6 | 8 |
| 2009 | 58 | 4 | 156 | 25 | 8 |
| 2010 | 57 | 7 | 128 | 6 | 7 |
| 2011 | 67 | 11 | 224 | 9 | - |
| 2012 | 103 | 6 | 771 | 18 | 9 |
| 2013 | 100 | 7 | 491 | 20 | 8 |
| 2014 | 42 | 8 | 430 | 12 | 5 |
| 2015 | 107 | 6 | 324 | 24 | 7 |
| 2016 | 93 | 12 | 452 | 15 | - |
| 2017 | 102 | 15 | 588 | 12 | 10 |
| 2018 | 118 | 13 | 793 | 24 | 8 |
| Cayman Brac |  |  |  |  |  |
| 2008 | 15 | 2 | 5 | 3 | 15 |
| 2013 | - | - | - | - | 15 |
| 2017 | - | - | - | - | 20 |
| 2018 | 36 | 5 | 136 | 27 | 19 |

-, no data of that type were collected that year.
growth rate in log space), and SD $\sigma_{\text {proc }}$ (process error). We use the following priors in the model: a uniform distribution with bounds -10 and 10 for $\bar{\mu}$; a uniform distribution with bounds 0 and 10 on $\sigma_{\text {proci }}$ and for $N_{y=1}$, an island-specific uniform distribution ( 0,1000 for Cayman Brac and 0,5000 for Little Cayman).

Informing $N_{y}$ Estimates from Binomial Resight Data. Because surveyors made every effort to avoid sampling the same fish within a count of 50, sampling was effectively conducted without replacement. Typically, this data type would be modeled using the hypergeometric distribution, a special case of the binomial distribution applicable when sampling is without replacement. However, because individual sample sizes (the number of fish sides counted in survey $i$ ) were small relative to the total population size, $N$, the hypergeometric distribution is approximated by the binomial distribution (51). We thus modeled the counts of sides of tagged individuals for survey $i$ in year $y$, $t_{i, y}$, using a binomial observation model:

$$
\begin{equation*}
t_{i, y} \sim \operatorname{binomial}\left(p_{y}, n_{i}\right) \tag{2}
\end{equation*}
$$

where $p_{y}$ represents the proportion of sides of fish in the aggregating population that are tagged in year $y$, and $n_{i}$ represents the number of fish sides counted in survey $i$. The proportion of tagged sides of fish in the FSA is equal to:

$$
\begin{equation*}
p_{y}=K_{y} /\left(2 N_{y}\right), \tag{3}
\end{equation*}
$$

where $K_{y}$ is the number of fish tagged at the aggregation site in year $y$, and $N_{y}$ represents the model estimated population size from Eq. 1.

Incorporating Surveyor Effect. Tag-detection rate may differ across surveyors. For instance, surveyors with more survey experience may detect tags with more accuracy than novices (i.e., they have fewer false-negative detections). Regardless of the specific mechanism, we can incorporate such surveyor random effects by altering the proportion of tagged sides of a fish in logit space. Eq. 2 becomes:

$$
\begin{equation*}
t_{i, y, a} \sim \operatorname{binomial}\left(p_{y, a}^{*}, n\right) \tag{4}
\end{equation*}
$$

where $p_{y, a}^{*}$ represents the proportion of tagged fish sides detectable for surveyor a in year $y$, such that:

$$
\begin{equation*}
p_{y, a}^{\star}=\frac{\exp \left(s_{y, a}\right)}{\left(1+\exp \left(s_{y, a}\right)\right)} \tag{5}
\end{equation*}
$$

where $s_{y, a}$ represents the modified proportion of tagged sides of a fish in logit space, such that:

$$
\begin{equation*}
s_{y, a}=c_{a}+\operatorname{logit}\left(p_{y}\right) \tag{6}
\end{equation*}
$$

where $c_{a}$ is a surveyor-specific random deviate away from the proportion of tagged-fish sides (in logit space) for surveyor a, with a normal distribution for a prior with mean 0 and SD $\sigma_{\text {percep }}$ (which has a uniform prior with lower and upper bounds of 0 and 5 , respectively).

Incorporating Video Census Data. By separating the process and observation components of our model framework, we afford the flexibility to inform the process model by more than one class of observations, e.g., an integrated population model (49). We leveraged this flexibility in order to incorporate both mark-resighting observations and counts from video census into a single model. To do so, we treated video census counts as imprecise observations of a proportion of the true population size. In other words, we estimate $\rho$, the proportion of the spawning population captured in the video. Thus, the video census observation process becomes:

$$
\begin{equation*}
\log \left(V_{m, y}\right) \sim \operatorname{Norm}\left(\log \left(\rho N_{y}\right), \sigma_{y}\right) \tag{7}
\end{equation*}
$$

where, $V_{m, y}$ is the count made by reviewer $m$ of video from year $y ; N_{y}$ is the spawning population in year $y$; and $\sigma_{y}$ is the SD in year $y$. We used a uniform distribution with bounds 0 and 1 on the prior of the proportion, $\rho$, and a uniform distribution with bounds 0 and 100 on the prior for $\sigma_{y}$.

Model Fitting. We used the programming language $R$ (52) and the package "R2jags" (53) to perform the Bayesian Monte Carlo Markov Chain sampling. To evaluate the need to include surveyor random effects on Little Cayman, we used the information criterion metric deviance information criterion (DIC). We compared the relative performance of different model parameterizations (parsimony)
by calculating the difference between the DIC of each model and that of the model with the lowest DIC ( $\Delta \mathrm{DIC}$ ). Due to the limited amount of data from Cayman Brac for the tagging model, we did not attempt to fit the Cayman Brac model with random surveyor effects. To evaluate convergence, we calculated the Gelman-Rubin statistic for every parameter, along with the number of parameters with Gelman-Rubin statistics greater than 1.01, 1.05, and 1.10.

The model for Little Cayman with just tagging data ran from 2008 to 2018 (years when we conducted tagging studies). The Little Cayman model including video census data ran from 2005 to 2018 (the range of years during which we captured video census, except 2007, 2011, and 2016, when conditions and fish behavior precluded video capture). The model for Cayman Brac runs from 2008 to 2018 as both datasets cover this period, although the observations across years were sparser than on Little Cayman (2 y of markresight data, 4 y of video census). All data and code used to develop our results are available at https://github.com/WaterLynn.

## Results

Across all years and both islands, we tagged 934 fish (Table 1). No tagged fish was ever resighted outside the island where it was tagged. Divers collected 4,540 resighting censuses in total, with the vast majority $(4,399)$ from the Little Cayman aggregation site. Similarly, most year-specific video census data came from Little Cayman ( 11 vs. 4 y in Cayman Brac). The 2 estimates of FSA size on the east-end Grand Cayman site yielded similar estimates of abundance ( 500 or less fish) despite a $6-y$ interval between the observations. Below, we present findings from the mark-resight model on Little Cayman and Cayman Brac without the video census data included. Subsequently, we present results from the integrated population model that contains both mark-resight data and video census data. None of the final models have parameters with Gelman-Rubin statistics larger than 1.05 , suggesting each achieved convergence.

Mark-Resight Model Results—Little Cayman: Basic Model and Model with Surveyor Effect. Both models show that the Little Cayman Nassau grouper FSA has dramatically increased since the start of the tagging program in 2008 (Table 2 and Fig. 2). The model with surveyor effect was $\sim 140$ DIC units lower than the basic model, suggesting strong support for differences in tag-detection ability among surveyors (Table 2). For 2018, the size of the Nassau grouper population attending the FSA for Little Cayman Island is estimated to be 5,223 individuals, $95 \%$ Bayesian credible interval (CI) of 4,413 and 6,310, an increase from the estimated $\sim 2,000$ fish in 2003.

To evaluate the assumption that the mean proportion of tagged fish remains constant across all surveys collected, we subset the data and compared model results from 1) all survey data, 2) surveys from dives on which more than 10 surveys were completed (i.e., dives where survey conditions were good), and 3) surveys from the day prior to, on, and after peak spawning (i.e., surveys conducted around the night we observed the most spawning). We found that posterior estimates of annual population size differed minimally (SI Appendix, Supplement C, Fig. S 1 ), and thus present only results using all survey data.

## Incorporating Video Census Data-Little Cayman and Cayman Brac.

By incorporating video, we can extend our population estimates for Little Cayman back to 2005 (Fig. 2). For Little Cayman, the results show that the population decreases from around 2,267 fish in 2006 ( $95 \%$ Bayesian CI of 1,910 and 2,636) to 1,256 in 2009 ( $95 \%$ Bayesian CI of 1,043 and 1,484), at which point, it increased steadily through time to reach 7,070 fish in 2018 (95\% Bayesian CI, 5,937 and 8,201). For Cayman Brac, the model results show minor increases in population size between 2008 and 2017 and then a large increase in the population size in 2018 to $\sim 1,900$ fish ( $95 \%$ Bayesian CI, 1,346 and 2,820; Fig. 3).

Table 2. Median posterior estimate of abundance and values for the $95 \%$ Bayesian Cl from the $\mathbf{2}$ state-space models fit using only tagging data for Little Cayman: basic model and the model incorporating surveyor effect

| Year | Basic model DIC $=9,219.7(\Delta \mathrm{DIC}=137.3)$ | Model incorporating surveyor effect DIC $=9,082.4(\Delta \mathrm{DIC}=0)$ |
| :--- | :---: | :---: |
| 2008 | $1,902(1,273,3,031)$ | $1,732(1,110,2,761)$ |
| 2009 | $1,741(1,479,2,080)$ | $1,684(1,326,2,157)$ |
| 2010 | $1,425(1,208,1,695)$ | $1,416(1,129,1,790)$ |
| 2011 | $1,819(1,607,2,069)$ | $1,712(1,383,2,101)$ |
| 2012 | $3,170(2,935,3,426)$ | $3,387(2,808,4,066)$ |
| 2013 | $3,192(2,905,3,546)$ | $3,014(2,524,3,680)$ |
| 2014 | $3,784(3,180,4,542)$ | $2,107(2,496,4,120)$ |
| 2015 | $4,681(4,086,5,414)$ | $4,754(3,861,6,007)$ |
| 2016 | $3,542(3,161,3,972)$ | $4,074(3,406,5,023)$ |
| 2017 | $7,075(6,201,8,181)$ | $6,821(5,636,8,425)$ |
| 2018 | $4,847(4,456,5,280)$ | $5,223(4,413,6,310)$ |

[^1]
## Discussion

The targeting of reef fish FSAs has resulted in pervasive overfishing of aggregating species throughout the world's oceans (14). At the same time, the importance of FSAs for population productivity and sustainability has crystalized within the fisheriesmanagement community $(3,54)$. This recognition has precipitated recent efforts to establish place-based and seasonal protections for FSAs, particularly in the tropical western Atlantic. To date, however, clear evidence remains scarce that such management actions can succeed. In this study, we conclusively demonstrate that aggressive FSA protections in the Cayman Islands have resulted in the sustained recovery of an endangered reef fish that was previously on the brink of extirpation.
Nassau grouper populations have experienced dramatic declines over the last century due to overfishing on FSAs (2, 17, 33, 34, 39). Nonetheless, the species remains important culturally,
economically, and ecologically. The anthropological importance of Nassau grouper stems from their role as a cultural symbol (29, $55)$ and as an economic tool $(5,39,56)$, both as a commodity from fishing and for recreational divers/snorkelers to enjoy (57, 58). Nassau grouper may also provide important ecological service as a control on populations of mesopredators $(59,60)$ and as a potential predator of the invasive lionfish $(61,62)$. Given the ecological and economic value of the species, many governments throughout the Caribbean have made efforts to recover the species through management actions such as fishing bans (38), seasonal closures (7), or marine protected areas $(46,63)$. Understanding the population response of aggregating species to such management actions requires accurate estimates of population size across time. While previous studies have used length-frequency data to show Nassau grouper population responses to conservation, e.g., Heppell et al. (7), few studies have showed responses in terms of


Fig. 2. Population estimates of Nassau grouper at the spawning aggregation on Little Cayman using the tagging data from 2008 to 2018 ( $A$ ) and using the tagging and video census data for 2005 to $2018(B)$. In both cases, the tagging model includes the surveyor effect. In both $A$ and $B$, the gray shaded area represents the $95 \%$ Bayesian Cl , and the black dots connected by the line are the median posterior estimates. In $B$, boxplots display counts from video censuses (jittered slightly along the $x$ axis for ease of viewing). The red $X$ denotes the median video census count divided by the median posterior estimate for the proportion of fish captured by the video census, and the blue diamonds are the median video census count divided by the 2.5 and $97.5 \%$ quantile of the posterior estimate for the proportion of fish captured by the video census.


Fig. 3. Population estimates of Nassau grouper at the spawning aggregation on Cayman Brac using the tagging data from 2008 and 2018 ( $A$ ) and using the tagging data and video counts for 2008 to $2018(B)$. In both $A$ and $B$, the black dots show the median posterior estimates, and the shaded boxes show the $95 \%$ Bayesian Cl in years with observations (tag and/or video census counts). In $B$, boxplots (see Fig. 2 for detailed boxplot explanation) display counts from video censuses (jittered slightly along the $x$ axis for ease of viewing).
changes in population size. While it could be argued that this paucity of evidence for population growth following spawning site protections is due to enforcement failures or biological phenomena-i.e., Allee effects, discussed by Allee (42), Gascoigne and Lipcius (43), and Sadovy de Mitcheson and Erisman (3)-it is also possible that the lack of examples stems, at least in part, from challenges associated with accurately estimating population size. Our work provides clear evidence that Nassau grouper FSAs can recover through concerted management action and effective enforcement and compliance (see SI Appendix, Supplement A, Table S1 for management timeline).
Nearly all studies presenting evidence for FSA overfishing rely on estimates of spawner abundance or catch at FSAs as a proxy for population status. That is, the change in the abundance or catch of spawners at the FSA is assumed to correlate with a change in stock status ( $2,14,54,64,65$ ). Multiple lines of evidence support this assumption. First, in areas with long-term catch records (e.g., Bermuda, Cuba), the collapse of catch at FSAs coincides with region-wide, persistent stock collapse (66-68). Second, multiple studies of aggregating grouper species have demonstrated high FSA site fidelity across spawning seasons, suggesting FSA attendants represent a persistent catchment of regional stocks (69-72). Finally, several tagging studies have demonstrated that the vast majority of reproductively mature individuals attend FSAs each year $(69,73)$. Taken together, these findings strongly support the assumption that changes in the size of an FSA are a proxy for changes in the regional stock of spawners. For the purposes of this study, we assume that islandspecific FSAs reflect island-specific stocks, because 1) prior tagging studies indicate that few (2), if any ( 69,74 ), Nassau grouper cross deep water ( $>250 \mathrm{~m}$ ) during reproductive migrations, and 2) none of our tagged fish from any year or island in our study were resighted outside the island on which they were tagged.

Regardless of the modeling methods or data sources used, the size of Nassau grouper FSAs on Little Cayman and Cayman Brac have increased. The increase in FSA size on Little Cayman is particularly apparent, where Nassau grouper have approximately
tripled in number since 2009 (Fig. 2). The Cayman Brac FSA also appears to have increased in abundance over this window of time (Fig. 3), although this finding is driven almost exclusively by observations from 2018. As such, it is not clear whether the rapid 2018 population increase is real or a manifestation of sparse observation coverage between 2008 and 2018. Ultimately, the 10-y gap in observations on Cayman Brac demands that we temper our conclusions regarding the ongoing recovery of Nassau grouper on that island. While the existing data are certainly suggestive of population growth, future observations will allow us to build confidence that Cayman Brac's population is, in fact, recovering. Based on our findings from 2018, the current population of Nassau grouper on Cayman Brac is roughly one-third that of Little Cayman, despite having a similar total area of habitat available (Fig. 1). It is therefore reasonable to assume that the population on Cayman Brac has potential for considerable future growth.

Rather than reflecting a lack of effort, the sparsity of data from Cayman Brac reflects the challenges of in situ observations at some FSA sites. FSAs, particularly for large-bodied grouper and snapper species, tend to occur at locations that are difficult to reach. While the Little Cayman Nassau grouper aggregation is arguably one of the most accessible in the Caribbean, it exists on an exposed shelf break, requires a $30-\mathrm{min}$ boat transit to the site, and can only be surveyed in good conditions by research divers with the skills and certification to regularly conduct $30-\mathrm{m}$ dives. Access to the Cayman Brac aggregation requires triple the transit time, and the aggregation typically forms below safe scientific research diving limits ( $>33 \mathrm{~m}$ ). Conditions at Grand Cayman's aggregation site preclude sustained research diving activities. The logistical challenges associated with collecting the types of data we present here over a decade or more of sampling will likely preclude the replication of our approach and findings at many, if not most, FSAs. On the other hand, emerging technologies, such as passive and active acoustics (75-78), hold promise for providing alternative forms of fisheries-independent observations to document conservation success elsewhere.

While we observed increases in FSA size on both Little Cayman and Cayman Brac, in neither case was the growth immediate or constant through time. The integrated population model applied to data from Little Cayman suggests that the abundance of Nassau grouper at the FSA may have declined somewhat between 2005 and 2008, despite spawning-site protections beginning in 2003. The cause of the apparent 5 -y delay in recovery following management action is unclear. However, the surprisingly high interannual variability in estimates of FSA size on Little Cayman, particularly when considering the mark-resight only model results (Figs. 2 and 3), may provide a clue as to the cause of this delay. A dramatic year-over-year increase in Little Cayman FSA abundance (e.g., 2016 to 2017) may be due to episodic recruitment, given that 1 ) the species has a pelagic larval duration of between 35 to $45 \mathrm{~d}(21,22)$, so stochastic oceanography may play a substantial role in establishing a successful year class, and 2) the proximal populations of Nassau grouper in the region have been fished to collapse ( $23,24,79$ ), so consistent larval supply from elsewhere is nonexistent. Therefore, the observed 2005 to 2008 decline may be attributed to a lack of strong year classes in the previous years.

This notion of episodic recruitment is supported by the fact that we observed a large recruitment event of 1-y-old fish on both Little Cayman and Cayman Brac in 2012 (80). Nassau grouper reach sexual maturity between 4 to 8 y of age (22), and, as such, the subadult Nassau grouper observed in 2012 should have matured and recruited to the FSA between 2015 and 2018. This timing coincides with the large population increases in the latter 3 y of this study (Fig. 2). The hypothesis of recruitment limitation due to region-wide overfishing fits within the broader notion that Allee effects act to suppress aggregating species following steep population declines (81-83). Other potential mechanisms contributing to recruitment-related Allee effects include a breakdown in spawning behavior at small FSAs (10) or a breakdown in the social transmission of FSA locations (e.g., "learning where to spawn") at low population sizes $(10,29)$. Regardless of the specific mechanisms leading to the apparent delayed recovery, it is clear that persistent long-term protections have the potential to ultimately foster recovery.

While we were unable to collect the tagging and video census data necessary to include Grand Cayman in our analysis, the management actions taken by the Cayman government encompass all 3 islands. Although exceptionally coarse, observational evidence from 2012 and 2018 suggests that the FSA has remained highly depressed ( 500 or less fish) over the same time frame that Little Cayman and Cayman Brac showed marked growth. The apparent failure of the Grand Cayman FSA to respond to management action may reflect the Allee effects described above. However, there is no doubt that a high level of reserve-boundary fishing observed between 2003 and 2016 contravened any potential population gains. In addition, the CI-DoE prosecuted multiple instances of poaching inside FSA reserve

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boundaries during this time. These issues, in part, led to the development and passage of the legislation establishing complete seasonal closures on the fishery in 2016. It remains to be seen whether this adaptive management will lead to sustained recovery on Grand Cayman. Nonetheless, our findings from Grand Cayman, while sparse, highlight the challenges of motiving FSA recovery in areas near large human populations.

This study quantitatively demonstrates sustained, multidecadal Nassau grouper recovery following conservation actions precipitated by fishing-induced collapse. The only other study we are aware of that documents recovery of a Nassau grouper population comes from the US Virgin Islands Grammanik bank, were divers estimated a change in FSA size from $\sim 30$ to $\sim 100$ fish over a $5-\mathrm{y}$ window of time (based on diver observations such as those we present here for Grand Cayman). Beyond Nassau grouper, studies have documented Red Hind (Epinephelus guttatus) FSA recovery on the Grammanik bank based on both length-frequency analysis (63) and abundance (70). In the Pa cific, researchers used transect methods to document increased abundance of multiple grouper species at a multispecies FSA site 5 y after community-based marine protected-area establishment (84). Across these studies, seasonal and place-based protections emerge as common management actions for success.

The Cayman Island government has taken a multifaceted management approach by enacting a closed season, creating year-round FSA site closures, and implementing gear restrictions, slot limits, and bag limits during the open season. Even with these aggressive management actions, it is clear that population recovery takes considerably longer than time-to-maturity for the species, indicating a multigenerational timeline is necessary for conservation success. In Little Cayman, for instance, after 15 y of protections, the population has only very recently recovered to near the estimated size of the FSA when discovered in 2001. Furthermore, despite having the same level of protection, the population on Cayman Brac appears to have only very recently undergone population expansion. Other countries with FSAs of Nassau grouper and other aggregating species should thus expect that management actions aimed at recovering FSA stocks, while ultimately effective, may take decades or longer to meet management targets.

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    Data deposition: All data and code used to develop the results reported in this paper are available on GitHub (https://github.com/VaterLynn) and Zenodo (DOI: 10.5281/zenodo.3585864).

    See online for related content such as Commentaries.
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[^1]:    DIC and $\Delta$ DIC values are given next to the model name.

