Origins of green turtle fishery bycatch in the central pacific revealed by mixed genetic markers

John B. Horne[1]*, Suzanne E. Roden[2], Erin L. LaCasella[2],
Amy Frey[2], Summer L. Martin[3], T. Todd Jones[3],
Shawn Murakawa[3], Shandell Brunson[3†], George H. Balazs[4]
and Peter H. Dutton[2]

[1]Southwest Fisheries Science Center, Marine Mammal and Turtle Division, National Research Council,
NOAA Fisheries, La Jolla, CA, United States, [2]Southwest Fisheries Science Center, Marine Mammal
and Turtle Division, NOAA Fisheries, La Jolla, CA, United States, [3]Pacific Islands Fisheries Science
Center, Marine Turtle Biology and Assessment Program, NOAA Fisheries, Honolulu, HI, United States,
[4]Golden Honu Services of Oceania, Honolulu, HI, United States

Longline fishing vessels, such as those that target tuna or billfish, also
unintentionally catch endangered marine turtle species on the high seas. The
stock composition of this bycatch is often unknown but potentially complex,
with individuals coming from many possible origins on an ocean-basin scale. To
better understand the stock composition of green turtle (*Chelonia mydas*)
bycatch we obtained 46 turtles, 27-91 cm in curved carapace length, caught
by Hawaii- and American Samoa-based pelagic longline fishing vessels across
large areas of the North- and South-central Pacific. We genotyped these at nine
microsatellite loci and one mitochondrial DNA marker, and used a baseline of
1,043 nesting female green turtles from beaches across the Pacific for population
assignment and mixed-stock analysis. By analyzing both marker types jointly we
were able to increase power and genetically resolve ten baseline stocks of
nesting females with mean self-assignment and simulated accuracies of 75-
97%. Above the Equator, green turtle bycatch was composed mostly of
individuals from Hawaiian and Eastern Pacific stocks, with a small number from
the Western Pacific. Below the Equator, the most common stocks in the bycatch
were from Australia and the Coral Sea, American Samoa and French Polynesia,
and the Galápagos Islands. Overall, turtles originating from East, West, and
Central Pacific breeding populations were major components of the bycatch,
suggesting that the geographic ranges of these populations overlap across large
tracts of ocean during the pelagic life history stages.

KEYWORDS

sea turtles, conservation genetics, population assignment, lost years, Pacific Ocean,
longline fisheries

Introduction

As adults, green turtles (*Chelonia mydas*) forage near shore and are the most frequently seen and photographed of all sea turtles, but as juveniles they are extremely rare (Witherington, 2002; Bolten, 2003). Like other species, green turtles enter the ocean immediately upon hatching and head for deep water, but it wasn't known where they went until Carr and Meylan (1980) first reported finding young green turtles in offshore sargassum mats. Moreover, before Reich et al. (2007) used stable isotope analysis to confirm a 3-5 year pelagic phase, it was unknown that greens were like other marine turtles in this regard. The elusiveness of juvenile green turtles is due to their active nature, as they swim more vigorously, dive more eagerly, and spend more time underwater than other species (Smith and Salmon, 2009; Witherington et al., 2012), making them difficult to study or sample. Consequently, there are many unanswered questions about the distribution and ecology of young pelagic-stage green turtles in the open ocean, and this is a major knowledge gap for a species currently protected by the US Endangered Species Act (Seminoff et al., 2015), and which plays an important functional role as a megaherbivore in marine ecosystems (Jackson, 2001; Burkholder et al., 2013; Pimiento et al., 2020).

In their early years, green turtles can disperse across thousands of km, sometimes against ocean currents (Luschi et al., 2003; Putman and Naro-Maciel, 2013; Putman and Mansfield, 2015), during which time they feed on a variety of animal and algal prey (Reich et al., 2007; Boyle and Limpus, 2008; Cardona et al., 2009; Howell et al., 2016; Esteban et al., 2020). As they attain curved carapace lengths of 20-30 cm, they become large enough to scavenge on longline fishing bait and are occasionally taken as bycatch (Work and Balazs, 2002; Petersen et al., 2009; Work and Balazs, 2010; Parker et al., 2011), though infrequently relative to their nesting abundances. Bycatch individuals are available only in small numbers, but offer a unique opportunity to examine the early life history of this conservationally important marine reptile.

The purpose of this study was to use green turtle bycatch, collected from longline fishing vessels based out of Hawaii and American Samoa, to investigate the spatial distribution of pelagic Pacific green turtles in the Central Pacific, and to determine the relative proportions of various Pacific breeding stocks present in the fisheries bycatch. The bycatch collection featured in this paper, while small, culminates decades of sampling effort and is, to our knowledge, the only of its kind for Pacific green turtles. A subset of the turtles from the Hawaiian longline fishery have been previously assessed for population of origin using mitochondrial DNA (mtDNA; Parker et al., 2011), but because some mitochondrial haplotypes were common across populations the origins of individuals possessing these variants could not be resolved. Therefore, for our study we used both mtDNA haplotypes and a suite of nuclear microsatellite loci to genetically assign turtles to more finely delineated baseline units.

Mixed-marker approaches involving both mtDNA and nuclear genetic loci have proven valuable for population-level studies in a number of marine taxa (Eytan and Hellberg, 2010; Horne et al.,

2011; Mesnick et al., 2011; Dibattista et al., 2012; Andrews et al., 2013; Iaccchei et al., 2013; and others). In sea turtles, however, mixed-marker study designs have not been as widely used, in part because nuclear DNA markers are sometimes assumed to be less sensitive to population differentiation, because male-mediated dispersal theoretically dilutes the strong natal homing signal captured by maternally inherited mtDNA (Bowen and Karl, 2007; Wallace et al., 2010). In spite of this, Stewart et al. (2016) showed that a separate population assignment using a suite of microsatellite loci added clarity to a mtDNA analysis of leatherback turtle bycatch, suggesting that microsatellite diversity can be a useful complement to mtDNA. In our study we take this a step further by using both marker types jointly in the same analysis to increase assignment power.

Hereafter, we show that by combining two marker types we were able to partition our genetic baseline into a larger number of reporting units, thereby increasing the geographic precision of genetic assignment without compromising much accuracy. Similarly, to Stewart et al. (2016), we also show that the nuclear microsatellite markers complemented patterns in the mtDNA much more often than not. The results presented herein suggest that future conservation genetic studies of sea turtles should consider the advantages of using multiple types of genetic markers.

Materials and methods

Genetic baseline, bycatch collection, and laboratory processing

As a baseline for genetic assignment and mixed-stock analysis, we drew on the respective mtDNA and microsatellite data of Jensen et al. and Roden et al. (2023), comprising 20 rookeries throughout the Pacific (Table 1; Figure 1). The samples from these two papers overlap and represent the most up-to-date compilation of new and previously published population genetic datasets for Pacific green turtles. Green turtle bycatch samples, with curved carapace lengths (CCL) of 27-91 cm, were acquired from longline fishing vessels based out of Hawaii and American Samoa (29 and 24 turtles, respectively). Tissue for DNA extraction was sampled at sea by trained observers between 1996 and 2017. Storage and transport of tissue collections, as well as laboratory processing, was performed using the same methods as Jensen et al. and Roden et al. (2023). Final products included a 770-bp fragment of the mitochondrial control region (see Dutton et al., 2014), and ten unlinked microsatellite loci.

Data processing and population genetics

Any turtle that was missing data at more than three loci (microsatellite or mtDNA) was removed prior to analysis. Loci were removed if they had more than 30% missing data in either the genetic baseline or fishery bycatch samples. Diversity statistics for

TABLE 1 Green turtle baseline and bycatch sample collections: Collection location, collection code, baseline reporting unit, year(s) of collection, number of samples genotyped, approximate decimal longitude and latitude, observed heterozygosity across nine microsatellite loci (H_O), mitochondrial haplotype diversity (h), and percent missing data (%NA).

collection	code	unit	year	n	Lat	Long	H_O	h	%NA
French Frigate shoals, Hawaii	FFS	FFS	1992-2010	95	23.753956	-165.870053	0.67	0.70	7.5
Revillagigedo Islands, Mexico	REV	REV	1999-2000	76	18.3467	-114.724864	0.65	0.68	2.3
Michoacán, Mexico	MICH	MICH.PCR	1996-1999	68	18.300953	-103.423894	0.69	0.69	9.4
Pacific Costa Rica	PCR	MICH.PCR	2004-2015	134	10.856828	-85.912519	0.64	0.79	2.5
Galápagos Islands, Ecuador	GAL	GAL	2001-2002	85	-0.562381	-90.629836	0.68	0.72	3.3
Mopelia, French Polynesia	FP	AS.FP	1991-2010	11	-16.692194	-153.971222	0.71	0.65	10.0
Huon Atoll, New Caledonia	NC	NC.CS.GBR.GoC	1993-2010	33	-18.040833	162.958889	0.69	0.85	10.5
Rose Atoll, American Samoa	AS	AS.FP	1995-2017	93	-14.546667	-168.151944	0.69	0.62	6.3
Cocos Island, Guam	GM	PL.FSM.GM.NM	2004-2010	15	13.444286	144.7937	0.63	0.00	6.3
Commonwealth of the Northern Marianas Islands	CNMI	PL.FSM.GM.NM	2010-2016	32	15.229606	145.721222	0.70	0.72	4.8
Ulithi Atoll, Federates States of Micronesia	FSM	PL.FSM.GM.NM	2005-2007	81	9.953956	139.906556	0.67	0.79	3.9
Helen Island, Palau	PL	PL.FSM.GM.NM	2000-2007	33	3.004583	131.124822	0.73	0.32	6.1
Wan-An, Taiwan	WAN	WAN	1995-2013	44	23.370689	119.502875	0.67	0.66	5.7
Lanyu, Taiwan	LY	LY	1996-2014	30	22.044542	121.548286	0.72	0.20	6.3
Republic of the Marshall Islands	RMI	RMI	2005-2008	104	8.158278	171.175689	0.72	0.52	2.8
Lihou Reefs, Coral Sea, Australia	CS	NC.CS.GBR.GoC	1992-1995	15	-17.386631	151.990164	0.78	0.26	15.1
Northern Great Barrier Reef, Australia	nGBR	NC.CS.GBR.GoC	1990-2008	48	-11.590156	144.035347	0.69	0.98	13.5
Southern Great Barrier Reef, Australia	sGBR	NC.CS.GBR.GoC	1989-1990	15	-23.441939	151.912697	0.64	0.00	12.3
Southern Gulf of Carpentaria, Australia	sGoC	NC.CS.GBR.GoC	1991-1999	22	-16.65835	139.870847	0.72	0.88	9.9
Northern Gulf of Carpentaria, Australia	nGoC	NC.CS.GBR.GoC	1991-1999	9	-12.298556	136.873632	0.67	0.80	9.0
Baseline Sample Totals				**1,042**			**0.72**	**0.94**	**6.2**
Hawaii longline bycatch	HLL		1996-2017	27	4.65 - 32.9	-178.7167 - -141.6667	0.70	0.91	5.1
American Samoa longline bycatch	ASLL		2006-2011	19	-16.2834 - -9.7167	-178.3167 - -156.2	0.66	0.93	3.0

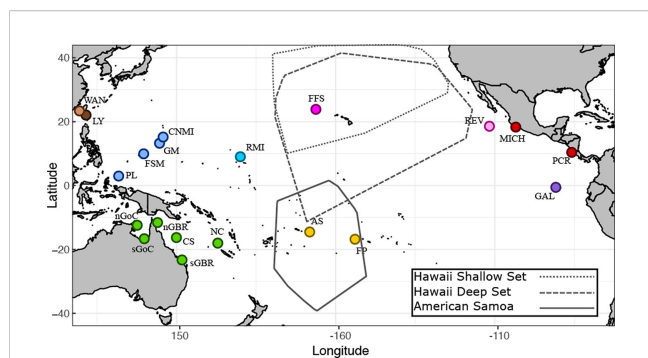The bold values are the total values for the baseline samples.

FIGURE 1
Geographic sampling locations for green turtles. Baseline nesting populations are indicated by circles. Population codes and colored reporting units are explained in Table 1. The areas encircled by polygons represent the spatial boundaries of longline fisheries. The Hawaii-based fishery is composed of two separate gear types (shallow and deep) that target different depths.

each baseline rookery and bycatch collection were calculated in the R package DiveRsity v. 1.9.90 (Keenan et al., 2013). Tests of Hardy-Weinberg equilibrium and the presence of null alleles for microsatellites were performed previously by Roden et al. (2023). To help inform the organization of baseline samples into reporting units for genetic assignment and mixed-stock analysis, we computed population-level genetic distances between all pairs of rookeries (microsatellite loci only) using the R package ADEGENET 1.5 (Jombart et al., 2011). Two different computations were used: Nei's genetic distance (Nei, 1978) which is a heterozygosity-based metric, and Edwards genetic distance (Edwards, 1971) which is an allele frequency-based metric. Both types of genetic distance were plotted as networks using the R package NETWORK v. 1.16.1 (Csardi and Nepusz, 2006) for visualization and interpretation. We also took into account the population genetic patterns in Jensen et al. and Roden et al. (2023) for combining rookeries into reporting units.

Mixed-stock analysis and genetic assignment

After considering genetic distances and other available results, the two primary criteria for determining reporting unit boundaries were mean simulated reporting accuracy and self-assignment rate, calculated using the R package RUBIAS v. 0.3 (Moran and Anderson, 2019). Self-assignment was the rate at which nesting females could be correctly grouped with other individuals from the same reporting unit given their genotypic similarity and using the leave-one-out method of Anderson et al. (2008). Reporting accuracy was assessed by simulating stock mixtures from baseline allele frequencies and was the proportion of the simulated mixture that was correctly identified by analysis. We simulated 10,000 mixtures, with a mixture size of 50, sampling all reporting units (repunit) uniformly from a flat Dirichlet distribution with a default sampling parameter of 1.5 per unit, allowing the proportion of reporting units in the mixture to vary randomly.

We aimed for accuracies of > 75% in at least one of the two approaches and tested different combinations of nesting populations iteratively, starting at the largest geographic scale (West-central Pacific vs. Eastern Pacific) and gradually splitting groups into the smallest units possible per our predefined criteria. If any nesting population had less than 20 individuals these were automatically combined with the most genetically similar population, or populations, into a single reporting unit. Pre-defined distinct population segments (DPSs) as recognized for *C. mydas* under The United States Endangered Species Act (Seminoff et al., 2015) were not used to determine reporting units, and neither were other proposed management units for this species (Wallace et al., 2010). To gauge the power of different marker types for genetic assignment and mixed-stock analysis, we simulated stock mixtures with the mtDNA and microsatellite loci separately as well as jointly. To assess whether the stock proportions of our different bycatch collections biased the analysis, we also retrospectively simulated 10,000 mixtures where the means of the Dirichlet sampling distributions for each repunit were the same as the mean mixing proportions estimated for fisheries bycatch, making the simulated stock mixtures more realistic for our data.

For our final mixed-stock analysis we ran RUBIAS with 10,000 iterations of the MCMC, discarding the first 1,000 samples as burn-in. Each mixture inference was also parametrically bootstrapped 1,000 times as a measure to reduce reporting unit biases (Moran and Anderson, 2019). The analysis was run ten times with different starting seed to ensure that mixing proportions remained consistent across runs. To assess whether any bycatch turtles could have originated from populations not represented by our baseline, we consulted the z-score values calculated by RUBIAS, which are the log-likelihoods for each individual compared to an expected distribution of log-likelihoods, while accounting for missing data (Clemento et al., 2014). The range of acceptable z-scores was determined by calculating the same statistic for nesting females from each reporting unit. Overall, an individual assignment to a reporting unit was considered plausible if the assignment posterior was greater than 0.70 and the z-score was larger than the reference minimum. An assignment was considered strong if the posterior was greater than 0.9 (Anderson et al., 2008) and the z-score was within the interquartile range of the reference.

Results

Final data

A total of 27 out of 29, and 19 out of 24, green turtle bycatch samples, respectively from the Hawaiian and American Samoan longline fisheries, were retained for analysis after filtering for missing data. For our baseline, 1,042 out of 1,111 nesting females were retained (Table 1). Out of ten original microsatellite loci, one was removed because more than 30% of bycatch samples had missing data at this locus. For comparison with Roden et al. (2023), the locus removed was A6. Missing genotypes made up 6.2% of the baseline data, with the Coral Sea rookery having the most missing data at 15% and the Revillagigedo Islands having the least at 2.3%. In general, the West Pacific was more genetically diverse than the East Pacific, with the highest diversity estimates belonging to southwestern rookeries (Table 1). Microsatellite genetic distances between rookeries were consistent at most scales (Figure 2), and mostly consistent with population structure reported in Jensen et al. and Roden et al. (2023).

Genetic baseline units

Based on a minimum self-assignment rate or simulated reporting accuracy threshold of 0.75, we resolved ten baseline reporting units from 20 green turtle nesting rookeries using mtDNA and nuclear microsatellite loci jointly (Tables 1, 2; Figure 1). Six of these units were represented by single nesting populations, and the rest grouped somewhat according to tectonic boundaries. The six Southwestern Pacific rookeries from Australian plate populations formed a reporting unit, as did the four rookeries from islands running the eastern boundary of the Philippine Plate. The two rookeries from the Central American coast formed a unit, while the last included American Samoa and western French Polynesia. With the exception of the Hawaiian Islands, all other Pacific Plate rookeries had some genetic similarities, sharing many of the same mtDNA haplotypes, and might have been combined into one reporting unit. However, the Marshall Islands also had similarities with the other Micronesian unit, could be considered intermediate between the Pacific Plate rookeries and the Philippine Plate rookeries, and had high enough accuracy scores to stand alone. American Samoa had high enough accuracy scores to be its own reporting unit as well, but French Polynesia was too small (n = 11) and was geographically close enough that combining the two rookeries made biological sense (Figure 2).

The Hawaiian reporting unit had the highest mean scores for self-assignment and simulated accuracy at 0.97 for both tests, while the Taiwanese Wan-An unit and the Galápagos unit had the lowest (Table 2). Notwithstanding that the Galápagos unit only had a
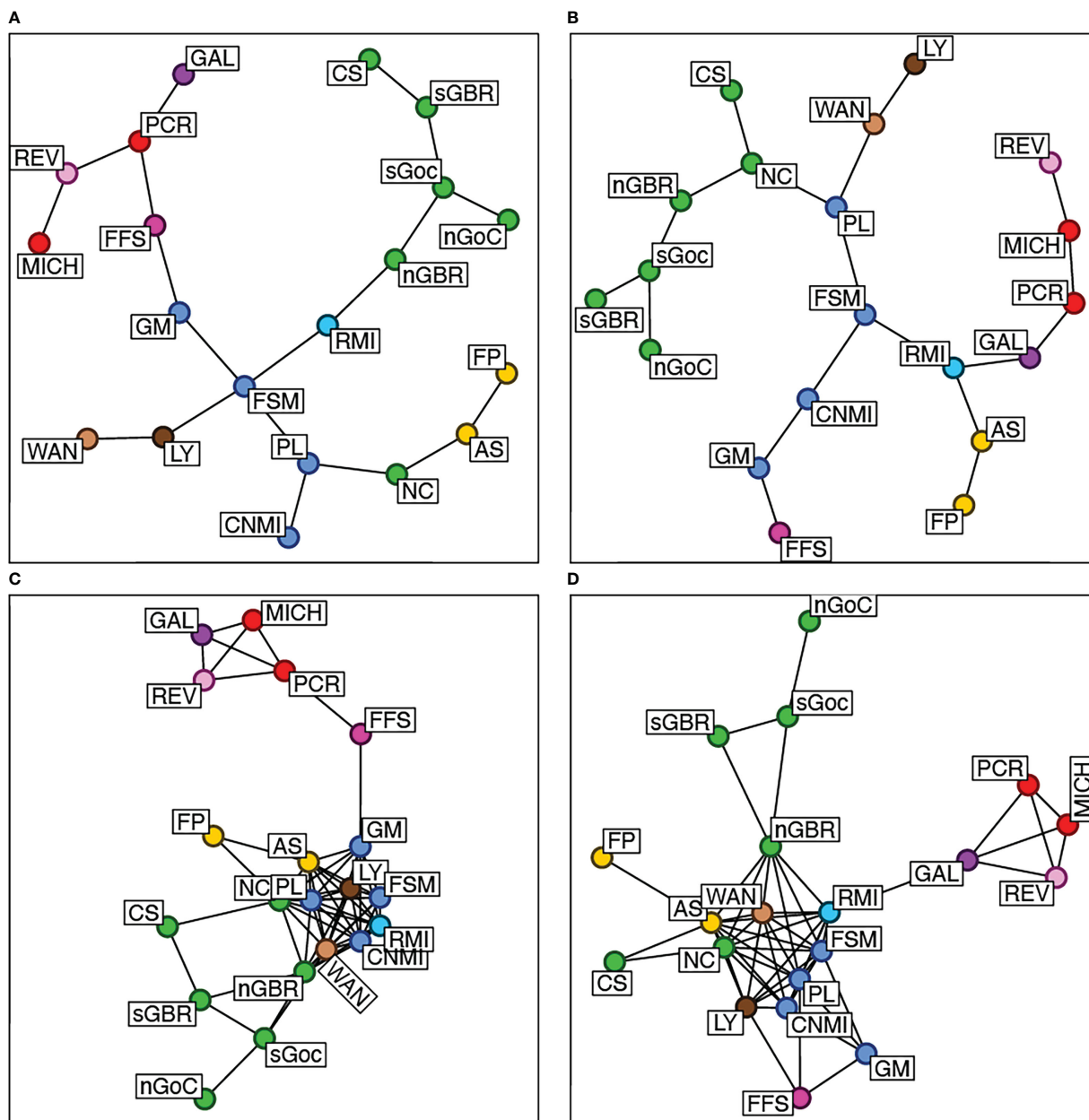
FIGURE 2
Genetic distance networks for all rookeries. Heterozygosity-based distances (Nei's distance, Nei, 1978) are in the left column **(A, C)**. Allele frequency-based distances (Edwards, 1971) are in the right column **(B, D)**. Minimum spanning trees are on the top row. Minimum spanning networks bottom row. Edge lengths are proportionate to genetic distance. Population codes and colored reporting units are explained in Table 1.

mean self-assignment rate of 0.65, the median self-assignment score for this reporting unit was 0.81 and median simulated reporting accuracy was 0.96. Furthermore, all individual assignments of bycatch to this reporting unit had high statistical support (Table 3), suggesting enough unique genetic diversity in this rookery to justify being separate from the other Eastern Pacific stocks.

Accuracy was greatly improved when both marker types were included, and every reporting unit showed some improvement (Table 2). For the Revillagigedo reporting unit, the combined self-assignment rate was almost 40 percentage points higher than using microsatellites alone. For the Marshall Islands unit, the combined

self-assignment rate was over 50 percentage points higher than for the mtDNA alone. These results argue that mixing marker types has an obvious benefit for genetic assignment and mixed-stock analysis of sea turtles, and that nuclear DNA markers generally enhance the signal of natal philopatry in the mtDNA rather than detract from it.

Mixed-stock analysis and genetic assignment

The results of mixed-stock analysis and genetic assignment were consistent across ten independent runs, suggesting that the

TABLE 2 Accuracy of mtDNA, microsatellite loci, and both marker types jointly, for genetic assignment and mixed stock analysis.

Unit	mtDNA		Microsatellites		Both	
	self-ass.	sim acc.	self-ass.	sim acc.	self-ass.	sim acc.
FFS	0.7847	0.8065	0.8157	0.8810	0.9675 (0.9999)	0.9712 (0.9999)
REV	0.6952	0.7870	0.4672	0.5950	0.8418 (0.9929)	0.8977 (0.9990)
MICH.PCR	0.8015	0.7227	0.6446	0.5559	0.8382 (0.9884)	0.7953 (0.9853)
GAL	0.4504	0.6155	0.4188	0.5703	0.6540 (0.8114)	0.7739 (0.9644)
AS.FP	0.7441	0.7363	0.5262	0.6018	0.8562 (0.9932)	0.8382 (0.9980)
RMI	0.2076	0.4027	0.6342	0.7600	0.7821 (0.9604)	0.8662 (0.9955)
PL.FSM.GM.NM	0.7401	0.5419	0.6823	0.6134	0.8190 (0.9762)	0.7502 (0.9447)
WAN	0.5197	0.5996	0.4892	0.6105	0.6587 (0.8786)	0.7585 (0.9825)
LY	0.6894	0.7988	0.5280	0.5755	0.8189 (0.9957)	0.8705 (0.9988)
NC.CS.GBR.GoC	0.7241	0.7099	0.5840	0.5047	0.8392 (0.9801)	0.7893 (0.9772)

Accuracy was assessed using mean self-assignment rates (self-ass.) and mean simulated reporting accuracy (sim acc.). Median values are reported in parentheses for the joint data set. Reporting accuracy was inferred from 10,000 simulated mixtures of 50 hypothetical bycatch turtles. Mixture simulations sampled simulated individuals from baseline reporting units evenly using a uniform Dirichlet distribution.

TABLE 3 Green turtle bycatch data: Bycatch collection, year collected, individual ID number, curved carapace length to the nearest half centimeter (CCL), mtDNA haplotype, assigned baseline reporting unit, assignment posterior, number of missing loci (nNA), and z-score.

Collection	Year	ID	CCL	mtDNA	Repunit	Posterior	nNA	z-score
Hawaii	1998	10922	32.0	CmP6.1	REV	0.9718	1	-0.1168
Hawaii	2013	117775	40.0	CmP3.1	FFS	0.9999	0	-0.9058
Hawaii	2010	123855	?	CmP5.1	MICH.PCR	0.9024	1	0.2228
Hawaii	2011	125672	61.5	CmP4.1	GAL	0.9854	0	1.2967
Hawaii	2011	125861	36.0	CmP1.1	FFS	0.9999	1	-0.9769
Hawaii	1999	12754	35.0	CmP3.2	FFS	0.9998	0	-1.2556
Hawaii	1999	13035	58.0	CmP4.6	GAL	0.9611	0	-1.2163
Hawaii	2013	136836	41.5	CmP1.1	FFS	1.0000	0	-0.0963
Hawaii	2014	139583	38.0	CmP1.1	FFS	0.9999	1	-0.5523
Hawaii	2000	16633	71.0	CmP4.1	GAL	0.9863	1	-0.5235
Hawaii	2000	17936	68.0	CmP4.1	GAL	0.9555	1	-2.1152
Hawaii	2000	17937	63.5	CmP4.6	GAL	0.9885	0	-0.4607
Hawaii	2000	17938	45.5	CmP4.6	GAL	0.9978	0	0.8289
Hawaii	2000	18846	43.5	CmP3.1	FFS	0.9999	0	-1.6800
Hawaii	2000	18847	45.5	CmP1.1	FFS	0.9999	0	-0.4667
Hawaii	2017	190874	49.6	CmP22.1	RMI	0.9884	1	-0.8973
Hawaii	2017	190890	65.0	CmP4.6	GAL	0.9998	1	0.9951
Hawaii	2002	30654	?	?	GAL	0.9983	2	0.0176
Hawaii	2006	60103	76.0	CmP4.6	GAL	0.9985	1	0.4521
Hawaii	1996	6587	44.5	CmP2.1	FFS	0.9999	0	-1.6375
Hawaii	1996	6595	78.0	CmP4.4	GAL	0.9999	0	-1.8178
Hawaii	1996	6598	76.0	CmP4.6	GAL	0.9915	1	-0.0629

(Continued)

TABLE 3 Continued

| Collection	Year	ID	CCL	mtDNA	Repunit	Posterior	nNA	z-score
Hawaii	2006	67206	53.5	CmP24.1	GAL	0.9998	0	-0.4929
Hawaii	2008	74327	70.0	CmP4.7	GAL	0.9997	0	0.8092
Hawaii	2009	80067	29.0	CmP1.1	FFS	1.0000	0	0.1579
Hawaii	1998	9248	70.0	CmP4.1	GAL	0.9745	2	-1.3625
Hawaii	2010	93889	38.5	CmP98.1	NC.CS.GBR.GoC	0.9986	0	1.2920
Hawaii	2011	125242	40.0	CmP49.3	–	–	7	–
Hawaii	2011	125862	91.0	CmP3.2	–	–	7	–
Samoa	2010	100689	42.0	CmP4.7	GAL	0.9275	1	-1.5647
Samoa	2010	100690	39.0	CmP22.1	GAL	0.9949	1	1.3296
Samoa	2011	105338	66.5	CmP4.1	GAL	0.9393	0	-0.2970
Samoa	2010	123186	46.5	CmP97.1	NC.CS.GBR.GoC RMI AS.FP	0.5329 0.1940 0.1955	2	-1.9251 -3.1655 -3.6363
Samoa	2010	124658	42.0	CmP65.1	AS.FP	0.9999	0	-0.9563
Samoa	2011	124659	50.0	CmP65.1	AS.FP	0.9998	0	0.2858
Samoa	2010	124660	45.5	CmP22.1	AS.FP RMI	0.6933 0.3057	0	-1.3346 -1.0235
Samoa	2011	125997	43.5	CmP47.1	NC.CS.GBR.GoC	0.9997	0	0.3089
Samoa	2011	125998	40.0	CmP47.1	NC.CS.GBR.GoC	0.9999	0	1.3239
Samoa	2011	126112	43.0	CmP47.1	NC.CS.GBR.GoC	0.7237	0	-0.5303
Samoa	2011	126113	59.5	CmP4.6	GAL	0.9852	0	0.3040
Samoa	2006	60104	27.0	CmP80.1	NC.CS.GBR.GoC	0.9999	0	0.7227
Samoa	2007	72288	47.5	CmP22.1	AS.FP	0.9898	0	0.1659
Samoa	2008	74423	42.0	CmP31.1	NC.CS.GBR.GoC	0.9987	0	0.3424
Samoa	2009	80064	46.0	CmP65.1	AS.FP	0.9998	1	-0.8098
Samoa	2009	93883	45.5	CmP65.1	AS.FP	0.9968	0	-1.8835
Samoa	2010	93885	45.0	CmP22.1	AS.FP RMI	0.5760 0.4064	0	-2.5537 -2.2458
Samoa	2010	94395	38.5	CmP31.1	NC.CS.GBR.GoC	0.9468	0	-0.4843
Samoa	2010	94394	27.0	CmP20.1	RMI PL.FSM.GM.NM	0.4961 0.4900	0	-0.2274 -0.6586
Samoa	2009	93880	46.5	CmP47.1	–	–	3	–
Samoa	2011	125674	44.0	CmP65.1	–	–	5	–
Samoa	2011	125675	33.0	CmP166.1	–	–	5	–
Samoa	2013	143641	48.0	CmP22.1	–	–	8	–
Samoa	2014	143643	40.0	CmP80.1	–	–	8	–

Ambiguous assignments are shaded and alternate reporting units are given. The available data for bycatch turtles with too many missing loci for genetic assignment are also shown.
The question mark indicates data that the curved carapace length (CCL) is unavailable for an individual. The dash indicates that we were not able to assign that individual to a reporting unit, due to missing data.

MCMC was able to adequately sample from the posterior distribution. The mean of all assignment posteriors for bycatch samples was 0.94, indicating that most assignments were highly supported. The mean z-score across samples was -0.39, which was within the interquartile ranges of all reference populations (Figure 3). Only four bycatch turtles were given assignments that were statistically unreliable, having a posterior less than 0.70, or a z-score below the reference minimums (Table 3).

Z-scores for green turtle bycatch assignments (grey boxplots) from Hawaiian and American Samoan longline fisheries. Reference Z-scores calculated from self-assignment for the six most common reporting units present in bycatch samples (colored boxplots).
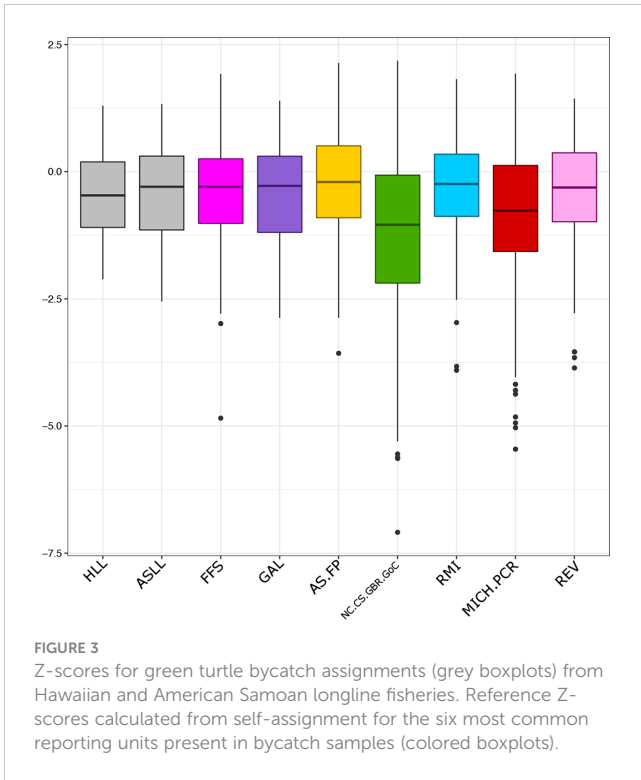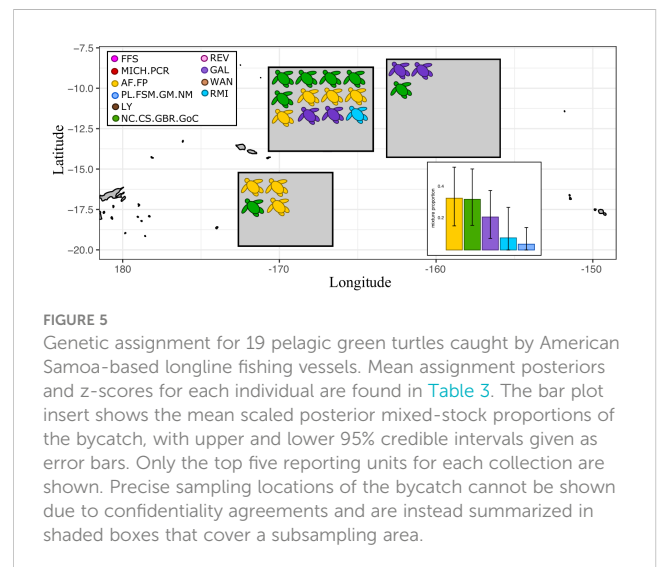
Turtles captured in the Hawaii-based fishery were mostly of Eastern Pacific origin. The Galápagos Islands reporting unit, in particular, represented over half of the total stock mixture with a
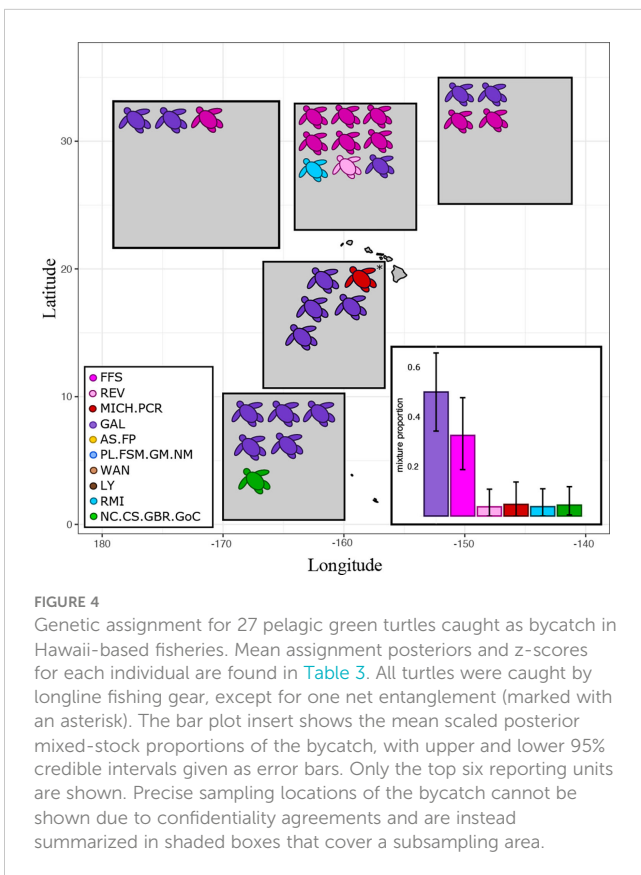
mean scaled posterior of 0.52. Hawaiian green turtles composed about a third of the mixture (mean scaled posterior = 0.32) and all of these were encountered north of the main Hawaiian Islands (Figure 4). Other reporting units in the stock mixture were present only at low frequencies, but the individual assignments of turtles from each of these units were strong. The one turtle assigned to the Central American reporting unit had a mtDNA haplotype that is private to the Colola rookery (CmP5.1), indicating that this individual came from mainland Mexico (Table 3). The one turtle assigned to the Southwestern Pacific unit (Australia, Coral Sea, and New Caledonia) had a haplotype that is private to the Northern Great Barrier reef (CmP98.1), suggesting that this individual may have come from Raine Island, the largest green turtle rookery in the world (Seminoff et al., 2015). We also looked at private microsatellite alleles to help identify the origins of turtles within their assigned reporting units, but private alleles in our baseline were present only at low frequencies and none of our bycatch samples, apart from a few individuals assigning to the Hawaiian reporting unit, exhibited private alleles. One unassigned individual (125862) had a haplotype known previously only from Hawaii, was 91 cm in curved carapace length, and large enough to be considered an adult (Figure 3).

The three most prevalent reporting units in the bycatch from the American Samoa collection were: American Samoa and French Polynesia (mean scaled posterior = 0.33), Southwestern Pacific (mean scaled posterior = 0.32), and the Galápagos islands (mean scaled posterior = 0.21). The other two units with top-five mixture proportions were both from Micronesia but the lower 95% boundary of the credible interval was zero in both cases (Figure 5). The one turtle in the American Samoa bycatch collection that was individually assigned to the Marshall Islands also showed genetic similarity to the Micronesian reporting unit that included Palau (Table 3), suggesting that this individual has a common Micronesian genotype and mtDNA haplotype. Of the seven turtles assigned to the Southwestern Pacific reporting unit, two had the same rare haplotype (CmP31.1) that is known only from the Coral Sea and New Caledonia, four had haplotypes CmP47.1 and CmP80.1 that are not known from the Gulf of

Genetic assignment for 27 pelagic green turtles caught as bycatch in Hawaii-based fisheries. Mean assignment posteriors and z-scores for each individual are found in Table 3. All turtles were caught by longline fishing gear, except for one net entanglement (marked with an asterisk). The bar plot insert shows the mean scaled posterior mixed-stock proportions of the bycatch, with upper and lower 95% credible intervals given as error bars. Only the top six reporting units are shown. Precise sampling locations of the bycatch cannot be shown due to confidentiality agreements and are instead summarized in shaded boxes that cover a subsampling area.

Genetic assignment for 19 pelagic green turtles caught by American Samoa-based longline fishing vessels. Mean assignment posteriors and z-scores for each individual are found in Table 3. The bar plot insert shows the mean scaled posterior mixed-stock proportions of the bycatch, with upper and lower 95% credible intervals given as error bars. Only the top five reporting units for each collection are shown. Precise sampling locations of the bycatch cannot be shown due to confidentiality agreements and are instead summarized in shaded boxes that cover a subsampling area.

Carpentaria and are uncommon in the Northern Great Barrier reef, suggesting that these individuals probably also came from the Coral Sea, New Caledonia, or the Southern Great Barrier Reef. The last mtDNA haplotype for this repunit (CmP97.1) is not known from any nesting population but the microsatellite data suggests that it comes from the Southwestern Pacific. One other bycatch turtle from the American Samoa longline fishery had an orphan mtDNA haplotype, but it was missing data at five out of the nine microsatellite loci so it was not suitable for genetic assignment. Bycatch turtles excluded from genetic assignment for missing data at too many microsatellite loci are also listed in Table 3, with their mtDNA haplotype for comparison with Jensen et al. (this issue).

All turtles in our bycatch collections had mtDNA haplotypes that were typical of the reporting unit they were assigned to, except for one: Turtle 100690 had the CmP22.1 haplotype that is known from American Samoa and the Marshall Islands, but this individual was assigned to the Galápagos Islands. We are unable to say whether this is a dubious assignment or if this turtle simply has an unusual genotype/haplotype combination, but the assignment to the Galápagos was strong with an assignment posterior greater than 0.99 and a positive z-score of 1.32. Therefore, in this one sample alone the signal in the microsatellites seems to be overpowering the signal in the mtDNA.

Post hoc tests of reporting unit accuracy revealed a linear relationship between simulated stock proportions and the estimation of those stock proportions (Figure 6), adding credence to our results in spite of the fact that our analysis was conducted using only nine microsatellite loci and one mtDNA marker. The Galápagos and Southwestern Pacific units had slight downward biases, and the Central American unit had a slight upwards bias at low mixing proportions, but all were nonetheless informative. Furthermore, there were no discernable differences in accuracy between reporting units present in both the Hawaiian and American Samoan fisheries, suggesting no biases between bycatch collections.

Discussion

Biogeography and life history

During their early years, green turtles live a cryptic existence in the open ocean and are not frequently encountered by humans, except as fisheries bycatch. Even so, they are caught less often than other species and typically only when young. For these reasons the distributions of young green turtles in pelagic habitats have been largely unknown, particularly in the Pacific which has received less research attention than the Atlantic. Our results show that at least seven out of the ten baseline units designated in this study were present in the green turtle bycatch, suggesting that the pelagic distributions from many different rookeries across the Pacific basin overlap broadly in the Central Pacific.

Green turtles from the Eastern Pacific have a different color phenotype, being darker than their western counterparts, and are previously known from Hawaiian waters (and as far west as New Zealand: Godoy et al., 2012), but mtDNA has been unable to precisely assign most of these turtles to their nesting populations

(Parker et al., 2011). Our mixed-marker assay better resolves genetic differences among Eastern Pacific rookeries and indicates a Galápagos origin for the majority of these individuals. The Galápagos also contributed substantially to the American Samoa bycatch, suggesting a strong presence of this reporting unit throughout the Central Pacific. Turtles assigned to the Galápagos were larger on average than those from other locations (Figure 7), with several individuals exceeding 70 cm CCL (Table 3), well above the 35-45 cm range at which greens typically transition to herbivorous diets and recruit to neritic habitats (Reich et al., 2007), and overlapping with the 60 cm CCL minimum size reported for Galápagos nesting females (Zarate et al., 2003). Parker et al. (2011) proposed several hypotheses for why eastern green turtles in the north Central Pacific tend to be larger, including an extended pelagic stage as an alternate life history, and facultative pelagic foraging by post-nesting females (see Seminoff et al., 2008). Whatever the case, our results show that eastern green turtles in the South Pacific also attain large sizes, and that this could be peculiar to the Galápagos population.

Satellite tagging studies conducted in the Gulf of Mexico show no evidence that ocean currents influence the dispersal trajectories of 14-30 cm green turtles (Putman and Mansfield, 2015, see also Polovina et al., 2006), but with so many individuals in our study assigned to the Galápagos, the possibility of turtles riding the large North and South Equatorial Currents into the Central Pacific is difficult to ignore. It's also worth pointing out that six turtles were caught in the North Equatorial Counter Current that spans 3-10 degrees north of the equator (Figure 4), one of these was assigned to the Southwest Pacific, possibly indicating current-use as a means of reaching the Central Pacific from the west. Young green turtles may not be passive propagules, but the algal rafts that provide them with food and cover are subject to ocean circulations (Thiel and Gutow, 2005) and could motivate turtles to go with the flow. Some evidence suggests that adult green turtles sometimes use ocean currents to migrate between foraging areas and nesting beaches (Luschi et al., 2003; Bass et al., 2006; Nishizawa et al., 2013), but at what point they learn to use currents is unknown.

Performance of the markers and baseline samples

The combined mixed-marker data set was considerably more powerful for genetic assignment than either marker type alone (Table 2). Therefore, mixing marker types allowed a finer partitioning of baseline units and greater assignment precision, without compromising much accuracy. In addition, because the two marker types have different modes of inheritance, and different substitution rates, together they offer a more complete representation of genetic diversity, not confined to strictly matrilineal gene genealogies but not excluding them either. Most assignments were consistent with the known distributions of mitochondrial haplotypes, indicating that microsatellite variation was largely in agreement with the mtDNA, while also increasing resolution. However, there were several ambiguous assignments in our results that highlight shortcomings in our marker panel and overall study design.
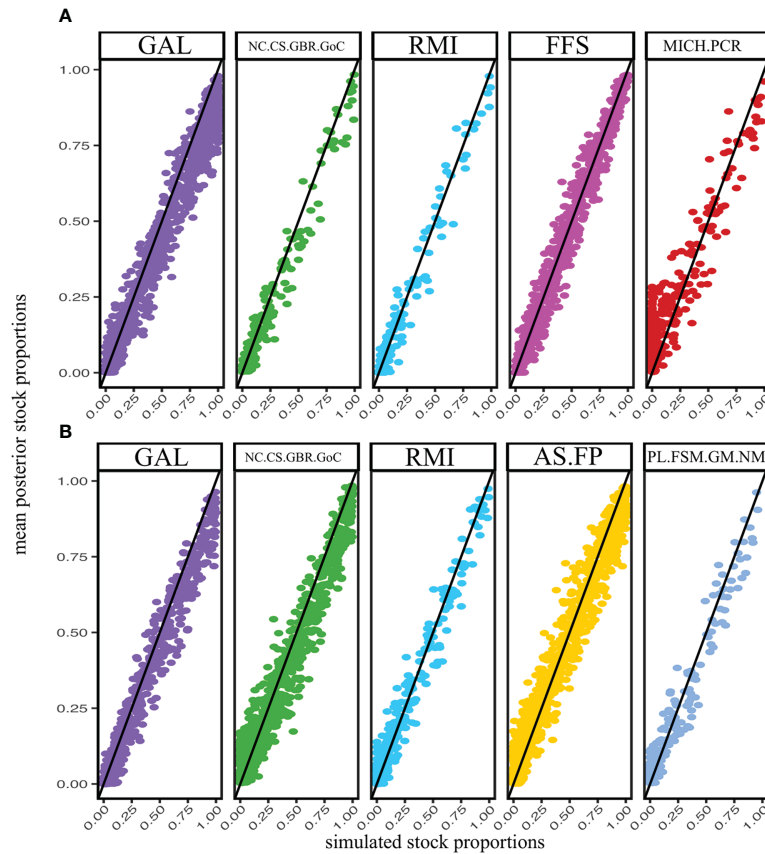
FIGURE 6
Comparisons of mean posterior stock estimations (y-axis) against simulated stock proportions (x-axis). Mixture simulations sampled individuals from a dirichlet distribution where the mean value for each reporting unit was the estimated mixing proportion for the Hawaiian and Samoan bycatch samples **(A, B)**, respectively. Only the five most common units for each collection are shown. Simulations were composed of 50 hypothetical bycatch turtles and 1,000 replicate iterations.

First, there were four individuals with assignment posteriors below 0.7 (Table 3). Considering the limited number of markers used, only four such individuals could be considered a success but all of them involved assignments to rookeries from the Western Pacific genetic cluster (Figure 2). Ambiguous assignments made up nearly a quarter of all Western Pacific assignments from this study,

suggesting that our marker panel did not characterize the genetic diversity of this region very well, though sample size was small. Confusion with the Marshall Islands was a feature of every ambiguous assignment, perhaps because this reporting unit had the weakest mtDNA genetic fingerprint (Table 2). The obvious solution to this problem is to increase the number of molecular
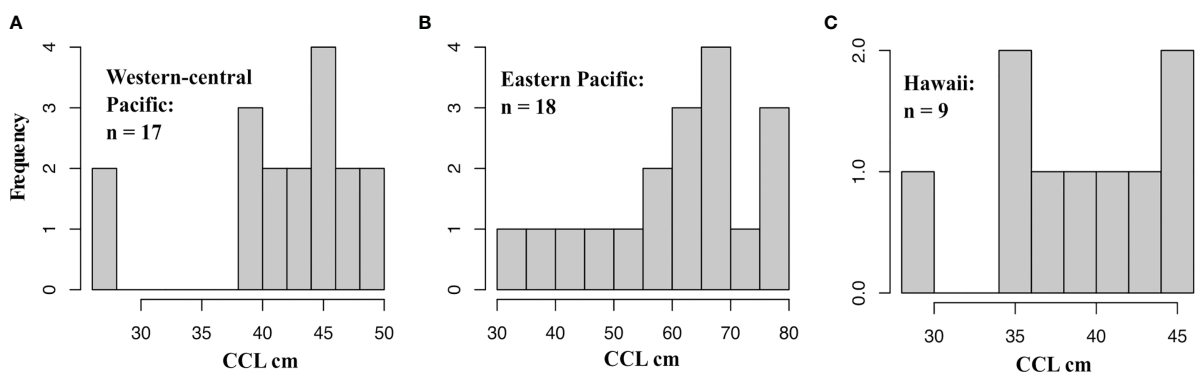
FIGURE 7
Histograms of curved carapace length (CCL) for all green turtle bycatch. **(A)** Turtles assigned to Western-central Pacific reporting units (NC.CS.GBR.GoC, AS.FP, RMI). **(B)** Turtles assigned to Eastern Pacific reporting units (GAL, MICH.PCR, REV). **(C)** Turtles assigned to the Hawaiian reporting unit (FFS).

markers used, specifically selecting for loci that better resolve the Western Pacific (see next section). Increasing resolution through larger marker sets also means increasing the number of reporting units, which will enhance assignment precision.

Large combined reporting units are undesirable for several reasons, aside from being imprecise for genetic assignment and mixed stock analysis. In our data, the combined reporting units had z-score distributions much lower than single-rookery units (Figure 3), making z-scores a less reliable statistic for assessing the quality of genetic assignments. Conglomerate reporting units also introduce bias into mixed-stock analysis because larger more diverse reporting units receive a larger mixing proportion when the information content of the genetic data is poor (Moran and Anderson, 2019). In our analysis we took measures to reduce reporting unit bias (see methods) but combining so many rookeries together, such as in the case of the Southwestern Pacific, should still be avoided when possible.

Second, based on all known green turtle nesting locations (Wallace et al., 2010; Seminoff et al., 2015) the baseline used in this study is largely comprehensive for Hawaii and the East Pacific populations, but significant gaps exist in the Western Pacific. Many nesting sites in New Guinea, Indonesia, the Philippines, Japan, mainland Asia, Melanesia, and elsewhere, could have contributed to green turtle bycatch assignment in the Central Pacific. Therefore, genotyping samples from an increased number of baseline rookeries will give context to mixed-stock analysis and help resolve ambiguities in the Western Pacific.

Green turtle conservation management and future directions

Genetic assignment and mixed-stock analysis are useful tools for conservation and management, especially when molecular markers are sensitive enough to finely delineate the stock structure of baseline samples (Beacham et al., 2009; Seeb et al., 2011; McKinney et al., 2017; Beacham et al., 2020). For sea turtles, it is recognized that new molecular assays are needed to better describe the genetic diversity of nesting populations and organize them into precise demographic units (Komoroske et al., 2017). Some labs, including ours, are currently exploring genome-wide SNP panels for sea turtle conservation genetics (Komoroske et al., 2018; Banerjee et al., 2020; Driller et al., 2020; Hamabata et al., 2020; Horne et al. 2023), but the results of the present study show that not all green turtle populations require extensive panels of molecular markers for reliable stock discrimination. Furthermore, new marker development may not be fruitful without increased baseline sampling (Komoroske et al., 2017). When designing new sets of genetic markers for sea turtles it should be remembered that programs such as RUBIAS accept all bi-parentally inherited loci, including SNPs, microsatellite variants, and indels, as well as maternally inherited mtDNA, or any combination thereof. As such, mixtures of different marker types, each with its own advantages (SNPs for genomic coverage and abundance, microsatellites for allelic diversity, and mtDNA haplotypes for their association with female natal homing) should not be

overlooked as best options for conservation genetics, both in terms of accuracy and cost effectiveness.

Inasmuch as the Central Pacific appears to be a crossroads for young green turtles, bycatch in this area has the potential to impact a large number of nesting populations. Turtles from nearby rookeries make up a significant portion of the bycatch (Hawaiian turtles in the Hawaiian fishery and American Samoan turtles in the American Samoan fishery; Figures 4, 5), so proximity to nesting beaches appears to influence mixed-stock proportions to some degree. But since many of the common reporting units in the bycatch, such as Hawaii, the Galápagos, mainland Mexico, American Samoa, and the Southwest Pacific, represent populations thought to be stable or increasing in numbers of nesting females (Seminoff et al., 2015), stock proportions could also be a reflection of reproductive output from major rookeries. However, turtles from struggling populations, such as the Marshall Islands (Seminoff et al., 2015), were also present in both fishery collections, in spite of small sample sizes. Therefore, the overall bycatch is collectively a well-mixed migrant pool consisting of individuals from diverse origins and represents an international marine management issue.

Though the data were limited, it may be worth noting that all bycatch individuals assigned to the Hawaiian reporting unit were encountered above 24 degrees latitude. If turtles from this rookery are primarily using pelagic habitat north of the main Hawaiian Islands during their early years, then this information could be helpful in managing the Hawaiian unit, which is currently recognized as its own DPS. Naro-Maciel et al. (2014) also show that adults foraging at Palmyra Atoll, just south of the main Hawaiian Islands (5.88°N, 162.1°W) do not come from the Hawaiian rookery, possibly supporting the idea that Hawaiian green turtles stay north. Without a larger mixture sample, it is difficult to draw such conclusions concretely, but given that the ranges of Pacific green turtles during their pelagic life history stages remain largely unknown, even incomplete patterns could provide clues for spatial management planning.

Data availability statement

The original data from this study are available from the Dryad data repository (www.datadryad.org) and are stored under the accession: https://doi.org/10.5061/dryad.905qfttqh.

Ethics statement

The animal study was reviewed and approved by Southwest Pacific Islands Institutional Animal Care and Use Committee (SWPI IACUC).

Author contributions

PD, JH, and SR designed the study. JH performed the data analysis, created the figures and tables, and drafted the manuscript. MtDNA sequencing and microsatellite genotyping was performed

Conflict of interest

Publisher's note

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