Warmer and wetter conditions will reduce offspring production of hawksbill turtles in Brazil under climate change

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Abstract

Climate change is expected to impact animals that are heavily reliant on environmental factors, such as sea turtles, since the incubation of their eggs, hatching success and sex ratio are influenced by the environment in which eggs incubate. As climate change progresses it is therefore important to understand how climatic conditions influence their reproductive output and the ramifications to population stability. Here, we examined the influences of five climatic variables (air temperature, accumulated and average precipitation, humidity, solar radiation, and wind speed) at different temporal scales on hawksbill sea turtle (Eretmochelys imbricata) hatchling production at ten nesting beaches within two regions of Brazil (five nesting beaches in Rio Grande do Norte and five in Bahia). Air temperature and accumulated precipitation were the main climatic drivers of hawksbill hatching success (number of eggs hatched within a nest) across Brazil and in Rio Grande do Norte, while air temperature and average precipitation were the main climatic drivers of hatching success at Bahia. Solar radiation was the main climatic driver of emergence success (number of hatchlings that emerged from total hatched eggs within a nest) at both regions. Warmer temperatures and higher solar radiation had negative effects on hatchling production, while wetter conditions had a positive effect. Conservative and extreme climate scenarios show air temperatures are projected to increase at this site, while precipitation projections vary between scenarios and regions throughout the 21st century. We predicted hatching success of undisturbed nests (no recorded depredation or storm-related impacts) will decrease in Brazil by 2100 as a result of how this population is influenced by local climate. This study shows the determining effects of different climate variables and their combinations on an important and critically endangered marine species.

Introduction

Changes in climate have already impacted the physiology, phenology, behavior, distribution, and reproduction of many species [1–3]. Species that are expected to be most vulnerable are
those that are heavily reliant on environmental temperature for their life history traits and/or those that exhibit temperature-dependent sex determination (TSD) [4–7]. This is the case for sea turtles, as their life history, physiology, and behavioral traits are heavily influenced by environmental temperature, particularly while their eggs are incubating [8–10]. Successful incubation of sea turtle eggs typically occurs within a specific thermal range of 25˚C–35˚C [8], with reduced embryonic development and altered hatching physiology being observed at extreme temperatures [11–13]. Moisture content also influences embryos with reduced development being observed when conditions are too moist/dry [14–16]. Further, the sex of sea turtle hatchlings is temperature dependent, with warmer sand temperatures producing a higher proportion of female hatchlings [17, 18]. Thus, any changes to the nesting environment can alter hatching phenotype and survival, impacting sea turtle populations [19–21].

The impacts of climate change on hatching production have already been observed through skewed sex ratios, malformations in hatchlings, lowered hatching success, and altered hatching behavior [13, 22, 23]. Therefore, concern exists over the potential impacts of climate change on hatching production and population stability [19, 24]. Most studies to date have focused on potential impacts of climate change on the primary sex ratio of hatchlings being produced at nesting grounds [22, 25–27]. However, recent studies have highlighted the fact that the effects of climate change on hatching production may be of greater concern to population stability [28–30]. Only a few studies to date have investigated the potential impacts of climate change on hatching production [28, 30, 31], indicating a potential variability in the influence and vulnerability of the different species and populations of sea turtles to various environmental and climatic factors [32]. Indeed, the various species and populations of sea turtles have different thermal tolerances [33, 34] and are also influenced differently by local climatic variables [28]. Further, as sea turtle species typically prefer to nest at different locations within a nesting beach (i.e. hawksbills nest on vegetation, whereas loggerheads nest on more open areas) [35–38], it is likely that there is variability on how they can cope with different environmental conditions. This indicates that local climate drivers of hatching output need to be explored at a species and nesting beach level.

To provide further insights into how sea turtle populations may be impacted by climate change, we expand from previous studies and explore the influences of five different climatic variables (air temperature, accumulated and average precipitation, humidity, solar radiation, and wind speed) on hawksbill sea turtle, *Eretmochelys imbricata*, hatching production from the coast of Brazil. This allowed us to determine which variable(s) and combination of variables have the most influence on hatching production of this critically endangered species, to identify nesting regions that are most susceptible to climate change, and to project future hatching success throughout the 21st century under extreme and conservative climate change scenarios.

**Materials and methods**

Fieldwork in Brazil was carried out by TAMAR (Brazilian Sea Turtle Conservation Program) under the permit # 41987 from SISBIO (Authorization and Information System on Biodiversity), and the Chico Mendes Institute for Biodiversity Conservation (ICMBio)/Ministry of Environment (MMA). The ethics committee from SISBIO and ICMBio considered animal ethics issues related to the project and the experimental design, and specifically approved this study.

**Study site and species**

We focused on the hawksbill sea turtle population that nests along the coast of Brazil. In Brazil, hawksbills nest at two major nesting regions: southern Rio Grande do Norte (RN) and...
northern Bahia (BA) [39], which represent the spatial extent of the present study (Fig 1). We used data from five beaches in RN: Cacimbinhas, Chapadao, Madeiro, Minas, and Sibauma and five beaches in BA: Arembepe, Busca Vida, Imbassai, Praia do Forte, and Santa Maria (Fig 1). Although the majority of hawksbill nesting occurs in BA, 42% of hawksbills are hybrids with loggerheads and 2% are hybrids with olive ridley sea turtles [40]. Despite having fewer hawksbill nests, RN has the highest density of nests per kilometer in the South Atlantic Ocean, with some areas experiencing 48.5 nests per kilometer per season [41]. The typical nesting season for hawksbills in RN is November–May, whereas in BA it is October–April [41, 42].

Nest data
Nest data was obtained from Projeto TAMAR, which conducts daily sea turtle patrols in RN and BA during the nesting season. We incorporated nest data from 2005–2016 across all 10 nesting beaches listed above. A total of 5,017 hawksbill sea turtle nests were analyzed (RN = 1,334 and BA = 3,683) (Table 1). Variability in the data, for each nesting beach, exists due to logistical and financial constraints involved in monitoring efforts. Only nests that were left in situ, had no record of disturbance (i.e. depredation, storm-related impacts, etc.), and had data on location, day laid, hatch date, and hatchling production (hatching success–number of eggs hatched within a clutch- and emergence success–number of hatchlings that emerged from total hatched eggs within a clutch) were included in this study (Table 1).

Climate data
Local climate data for RN and BA from 2005–2016 was obtained from weather stations located in Natal, RN and Salvador, BA, which are maintained by the Brazilian National Institute of Meteorology (INMET; http://www.inmet.gov.br/portal/). These weather stations collect hourly data on air temperature (°C), precipitation (mm), humidity (%), solar radiation (KJ/M²), and wind speed (m/s). Distances between weather stations and nesting beaches vary between 28–79 km (Table A in S1 File). Months where climate data was not available were excluded from any analyses are in Table B in S1 File.

Projected climate data for RN and BA were obtained from CMIP5 (Coupled Model Inter-comparison Project Phase 5) from the KNMI (Royal Netherlands Meteorological Institute) Climate Explorer (https://climexp.knmi.nl/start.cgi), which is a tool used to store climate data and make it easily accessible. We used multi-model means from the extreme RCP (Representative Concentration Pathway) 8.5 scenario and the conservative RCP 4.5 scenario. RCP 8.5 predicts a large increase in global temperatures though the year 2100 due to increasing greenhouse gas concentrations. RCP 4.5 predicts a milder increase in global temperatures through the year 2100 due to predicted future stabilization of greenhouse gas concentrations.

Analysis
Hatching success and emergence percentages were transformed using arcsine to normalize the data. A one-way ANOVA was used to compare hatchling production between regions and across nesting beaches within each region. Levene’s test, with center mean, found the variances for both hatching success and emergence success between nesting beaches in RN (p < 0.01, both hatching success and emergence success) and BA (p < 0.01, both hatching success and emergence success) to not be homogenous. Therefore, Tamhane’s T2 test was conducted to analyze how hatchling production may differ between nesting beaches within each region.

Generalized Linear Mixed-Effects Models in package “lme4” [43], with the binomial family in package lme4, were used to test the influences of local climate on hatching success and emergence success. Year was set as a. To best fit these models, hatching success and emergence
success data were presented as successes and failures. For instance, hatching success consisted of the number of eggs that hatched versus those that did not, while emergence success consisted of the number of hatchlings that emerged from hatched eggs versus those that did not. Corrected Akaike Information Criterion (AICc) was used to identify the best model within each region. Using the best models, hatching success was projected into the future under conservative and extreme climate change scenarios for each region. Emergence success was not projected due to its potential to be heavily influenced by sand compaction, substrate type, and hatchling performance, which were not measured here [44]. R version 3.4.2 was used for all analyses.

The predictor variables used were: average air temperature (temp), accumulated precipitation (acc.rain), average precipitation (avg.rain), average humidity (humid), average solar radiation (rad), and average wind speed (wind). These predictors were explored at various temporal scales: the month nests were laid (0.climate variable), the month nests were laid and one-month prior (0.1.climate variable), the month nests were laid and two months prior (0.2.climate variable), two months prior to nesting (2.climate variable), and during the incubation period (inc.climate variable). Existent research has shown that air temperature and precipitation as well as humidity have significant influences on hatchling output due to the variability that may exist in moisture throughout the nesting season (i.e. dry and wet seasons) and across regions [15, 28, 38, 45]. Therefore, accumulated precipitation, average precipitation, and humidity predictors were combined with average air temperature during incubation to explore their combined effects on hatchling production. Precipitation projections were presented as mm/day. Therefore, to project accumulated precipitation, these values were converted into mm/month.

Results

Hatchling production

Hatching success of undisturbed nests laid between 2005–2016 varied across years, regions and nesting beaches (Table 2). BA had the highest average hatching success (76.3% ± 21.6 SD),

Table 1. Nest data between and within regions.

| Region | Beach      | Number of Nests (Proportions) |
|--------|------------|-------------------------------|
| RN     | Cacimbinhas| 516 (38.7%)                   |
| RN     | Madeiro    | 278 (20.8%)                   |
| RN     | Chapadao   | 95 (7.1%)                     |
| RN     | Minas      | 308 (23.1%)                   |
| RN     | Sibauma    | 137 (10.3%)                   |
| BA     | Imbassai   | 533 (14.5%)                   |
| BA     | Praia do Forte | 636 (17.3%)                 |
| BA     | Arembepe   | 1,414 (38.4%)                 |
| BA     | Santa Maria| 587 (15.9%)                   |
| BA     | Busca Vida | 513 (13.9%)                   |

Hawksbill sea turtle nest data from Rio Grande do Norte (RN) and Bahia (BA) considered in this study between 2005–2016 (n = 5,017). The number and proportion of nests within each region and across nesting grounds, from north to south.
Table 2. Hatchling production between and within regions.

| Region | Nesting Beach | Hatching Success (%) | Emergence success (%) |
|--------|---------------|----------------------|-----------------------|
| RN     | Cacimbinhas   | 75.2% ± 22.5 SD      | 88% ± 15.4 SD         |
|        | Madeiro      | 77.2% ± 20.3 SD      | 89.2% ± 15.4 SD       |
|        | Chapado      | 80% ± 19.3 SD        | 91.2% ± 11.7 SD       |
|        | Minas        | 65.4% ± 27.3 SD      | 81.9% ± 18.5 SD       |
|        | Sibauma      | 70.7% ± 24.7 SD      | 84.8% ± 16 SD         |
|        |              | 74.6% ± 24.2 SD      | 88.2% ± 16.4 SD       |
| BA     | Imbassai     | 76.3% ± 21.6 SD      | 86% ± 14.1 SD         |
|        | Praia do Forte | 70.2% ± 24.6 SD      | 83.2% ± 16.9 SD       |
|        | Arembepe     | 63.4% ± 23.9 SD      | 83.2% ± 16.7 SD       |
|        | Santa Maria  | 88.2% ± 12.6 SD      | 90.9% ± 9 SD          |
|        | Busca Vida   | 69.2% ± 21.8 SD      | 83.2% ± 14.5 SD       |
|        |              | 73.9% ± 18.2 SD      | 82% ± 14.3 SD         |

Average hatching success and emergence success from 2005–2016, with their respective standard deviations, at each nesting beach in Rio Grande do Norte (RN) and Bahia (BA), from north to south, throughout the study period.

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while the average at RN was 75.2% ± 22.5 SD (Table 2). No significant difference was found in hatching success across years between states (ANOVA, F = 2.8, DF = 1, p = 0.09). A significant difference was found in hatching success across years between nesting beaches in RN (ANOVA, F = 12, DF = 4, p < 0.01) and between nesting beaches in BA (ANOVA, F = 291.2, DF = 4, p < 0.01) (Table C in S1 File). In RN, the beach with the highest hatching success was Madeiro (80% ± 19.3 SD), while Chapado had the lowest (65.4% ± 27.3 SD) (Table 2). In BA, the beach with the highest hatching success was Arembepe (88.2% ± 12.6 SD), while Praia do Forte had the lowest rates (63.4% ± 23.9 SD) (Table 2). April had the highest average hatching success across both RN (82.3%) and BA (82.6%; Fig 2A). November had the lowest hatching success in RN (72.2%), while October had the lowest average hatching success in BA (69.9%; Fig 2A).

![Fig 2. Hatchling production within regions.](https://doi.org/10.1371/journal.pone.0204188.g002)
Emergence success of undisturbed nests laid between 2005–2016 also varied across years, states, and nesting beaches (Table 2). RN had the highest average emergence success at 88% ± 15.4 SD, while the average at BA was 86% ± 14.1 SD (Table 2). A significant difference was found in emergence success across years between states (ANOVA, F = 57.3, DF = 1, p < 0.01) and across years between nesting beaches in RN (ANOVA, F = 13.8, DF = 4, p < 0.01) and between nesting beaches in BA (ANOVA, F = 65.7, DF = 4, p < 0.01) (Table C in S1 File). Similar to hatching success, Madeiro had the highest average emergence success in RN (91.2% ± 11.7 SD) and Chapadao had the lowest (81.9% ± 18.5 SD) (Table 2). In BA, Arembepe had the highest average emergence success (90.9% ± 9 SD), while Busca Vida had the lowest (82% ± 14.3 SD) (Table 2). May had the highest emergence success in RN (95.6%), while April had the highest emergence success in BA (92.4%; Fig 2B). January had the lowest emergence success in RN (84.8%), while December had the lowest emergence success in BA (82.1%; Fig 2B).

Local climate

Hawksbill sea turtles nest during the warmer months of the year throughout RN and BA (October–May) (Fig 3). RN is the warmest of the two regions being closer to the equator than BA (Fig 3A). In RN, the warmest month is February (27.64˚C ± 0.4), while in BA the warmest month is March (27.35˚C ± 0.64) (Fig 3A). During February and March, adult females are still nesting in high proportions, but hatchlings are incubating and emerging from nests (Fig 3A). The wettest month in both RN and BA is May, with an accumulated precipitation of 200.92 mm ± 153 in RN and 190.35 mm ± 129 in BA (Fig 3B). Likewise, May had the highest average precipitation in both RN and BA, with 0.31 mm/day in RN and 0.26 mm/day in BA (Fig 3B). In May, there is no nesting in BA and nesting is finishing in RN, but hatchlings are still incubating and emerging (Fig 3C). RN receives more solar radiation than BA, likely due to its proximity to the equator (Fig 3D). The month with the highest average solar radiation in RN is October (1907.7 KJ/M² ± 198.7), while in BA it is January (1754.2 KJ/M² ± 158.2) (Fig 3D). In RN, there is no nesting in October, when solar radiation is highest (Fig 3D). On the other hand, January is when solar radiation and nest proportions are at their highest in BA (Fig 3D). BA is more humid than RN and May is the most humid month in both RN (79.2% ± 2.05) and BA (80.3% ± 5) (Fig 3E). In May, nesting has ended in BA and is ending in RN, but hatchlings...
are still incubating and emerging (Fig 3E). RN is windier than BA, with October being the windiest month in both RN (5.29 m/s ± 0.5) and BA (1.82 m/s ± 0.34) (Fig 3F). There is no nesting in October in RN, while October has the lowest proportion of nests in BA (Fig 3F).

Effects of local climate on hatchling production output

Throughout Brazil, the model with the lowest AICc and high significance for hawksbill hatching success was average air temperature during incubation in combination with accumulated precipitation during the month nests were laid and two months prior (p < 0.001 for both parameters; Fig 4A, Table D in S1 File). This model showed lower hatching success when conditions were warm and dry (Fig 4A). For emergence success throughout Brazil, the model with the lowest AICc and high significance was average solar radiation during incubation (p < 0.001; Fig 4B, Table D in S1 File). Emergence success decreased with increasing solar radiation (Fig 4B).

Across RN, the model with the lowest AICc and high significance for hatching success was average air temperature during incubation in combination with average precipitation during the month nests were laid (p < 0.001 for both parameters; Fig 4C, Table D in S1 File). This model indicated that warmer and drier conditions decreased hatching success (Fig 4C). The model with the lowest AICc and high significance for emergence success across RN was average solar radiation during incubation (p < 0.001) (Fig 4D, Table D in S1 File). Here, higher solar radiation decreased emergence success (Fig 4D).

The model with the lowest AICc and high significance for hatching success across BA was average air temperature during incubation in combination with accumulated precipitation during the month nests are laid and 2 months prior (p < 0.001 for both parameters; Fig 4E, Table D in S1 File). This model indicated that warmer and drier conditions decreased hatching success (Fig 4E). For emergence success across BA, the model with the lowest AICc and high significance was average solar radiation during incubation (p < 0.001; Fig 4F, Table D in S1 File). Here, higher solar radiation decreased emergence success (Fig 4F).

Climate projections

By 2100, air temperatures at RN are projected to increase throughout the nesting season by 1.4–4˚C with November being the warmest month under RCP4.5 at 29.4˚C and 31.5˚C under...
RCP8.5 (Fig 5A). Average precipitation projections vary throughout the 21st century, however there is a general increase of 0.11–1.86 mm/day throughout the nesting season in RN (Fig 5B). November is projected to be the wettest month by 2100 under RCP4.5 at 1.03 mm/day and under RCP8.5 at 1.89 mm/day (Fig 5B). Air temperatures in BA are projected to increase throughout the nesting season by 1.8–5˚C with March being the warmest month under RCP4.5 at 29.3˚C, but the warmest month under RCP8.5 is projected to be January at 32˚C (Fig 5C). Accumulated precipitation is projected to vary, but there is a general increase of 0.9–22.3 mm throughout the nesting season in BA (Fig 5D). May is projected to be the wettest month by 2100 under RCP4.5 at 185.7 mm and under RCP8.5 at 180.1 mm (Fig 5D).

Hatching success projections

We used the best fit models describing hatching success at RN (air temperature during incubation in combination with average precipitation during the month nests were laid) and BA (air temperature during incubation in combination with accumulated precipitation during the month nests were laid and two months prior) as well as our climate deltas to project hatching success throughout the 21st century. Our models predicted average hatching success to decrease in both RN and BA thought the 21st century. By 2100, hatching success in RN is projected to decrease from an average across the study period of 75.2% to 72.6% under RCP4.5 and to 70.9% under RCP8.5 (Fig 6A). Hatching success in BA is projected to decrease from an average across the study period of 76.3% to 65.1% under RCP4.5 and 69.6% under RCP8.5 (Fig 6B).

Discussion

Hawksbill nesting beaches in Brazil are projected to experience decreases in hatching success of up to 11% by 2100 due to warming air temperatures and increases in precipitation. Across all regions, higher hatching success was observed in cooler and wetter conditions. A positive influence of precipitation on hatching success was found across Brazil and within both regions, which may be a reflection of an absence of adequate moisture levels at these nesting grounds,
where most of the nesting (January to March) occurs during the drier months of the season [38, 45]. Wetter, more moist conditions may offset increases in temperature maintaining cooler sand temperatures [15, 46–48]. Hawksbills nesting in Bahia experience different climatic conditions than those nesting in Rio Grande do Norte despite their proximity. In particular, the rate of precipitation differs between the regions throughout the nesting season, which is likely the reason for the different influences of precipitation. Bahia had a slightly higher average hatching success than Rio Grande do Norte during the study period, yet Bahia is predicted to experience stronger declines by 1.3–7.5%. Bahia is the main nesting region for hawksbills in the Southern Atlantic Ocean. Being a critically endangered species, these predicted decreases are concerning. As climate change progresses and conditions become wetter, there is a potential for further reductions in hatching production, since very wet conditions can result in soil saturation or a rise of the water table level displacing air between sand particles, suffocating embryos and resulting in clutch failure [28, 49, 50]. This is the case for loggerhead turtles in Brazil, where a negative effect of precipitation on loggerhead hatching success was found for nesting beaches in Bahia that are shared between loggerhead and hawksbills, specifically in Praia do Forte and Santa Maria [51]. This is likely a reflection of the fact that the peak for loggerhead turtle nesting in Brazil overlaps with the wettest months (October to December) of the season and these areas already experience high levels of rain [38, 45, 51]. Interestingly, although hawksbill and loggerhead turtles have some common nesting areas in Bahia, Brazil [42, 52], the relationship between precipitation and hatching success for these species are different. This variability may be driven by differences in nesting seasonality.

Hawksbill turtles are known to nest near or within vegetation, further from the high-water mark than loggerhead turtles [35–37, 53]. Sand temperatures tend to be significantly cooler in areas with vegetation than in open areas [54, 55]. Indeed, mean incubation duration for hawksbill turtles is longer than for loggerhead turtles in Bahia, Brazil, indicating that hawksbill eggs are incubating at cooler temperatures [42, 52]. Sea turtle nesting behavior and historical nest placement may drive the tolerance of species to thresholds of incubating parameters (i.e. moisture, temperature) and drive the adaptive differentiation of species at fine spatial scales.
Indeed, it was found that hatchlings of females nesting on a naturally hot (black sand) beach survived better and grew larger at hot incubation temperatures compared to the offspring of females nesting on a cooler (pale sand) beach nearby [56]. Thus, it could be speculated that the thermal tolerances of loggerhead eggs incubating in Brazil are higher than those for hawksbill turtles. Furthermore, there is a high prevalence of hybridization between hawksbill and loggerhead sea turtles with 42% being morphologically assigned as hawksbills [40]. Hatching success between hybrids and their parental species are not significantly different, however hybrid emergence success were found to be lower than the parental species [57]. Therefore, these hybrids may endure in Brazil likely impacting global sea turtle populations. Despite this potential, the responses of hybrids to climate remain unknown.

With projected changes in climate, it is important to understand the climatic thresholds for various species of sea turtles to better project potential impacts and to inform management. Thermal tolerances are known to vary between species of sea turtles [32] and are also likely to vary between populations and within nesting grounds as a reflection of strong site fidelity by individual females. Future studies should also explore whether sea turtles are able to locally adapt to other environmental conditions (i.e. moisture) and integrate these findings into models that predict population responses to climate change. Similarly, a better understanding of the interacting and synergetic effects of various environmental conditions (temperature, moisture, etc.) is necessary. The effects of temperature on hatching output is relatively well understood [58–60] with recent advancements in our understanding of the effects of moisture [15, 48, 61]. However, other less studied environmental variables may be affecting the reproductive output of sea turtles at nesting grounds. Here, we also explored how solar radiation and wind speeds may influence hatching output. Although our study suggests air temperature and precipitation to be most significant, solar radiation, was a good predictor and had a negative effect on emergence success across Brazil and within both regions. High solar radiation can enhance the effect of warm air temperatures by warming the sand, and thus heating nests beyond the thermal threshold, potentially negatively impacting hatching production [62]. Further, sand temperatures that are too warm, and consequently very dry, can reduce successful hatching emergence since it can cause nests to cave-in making it difficult for hatchlings to emerge [12, 63]. Ultimately, if nesting and incubating conditions are not favorable, as a consequence of climate change or other threats, sea turtles will need to respond and adapt accordingly.

Sea turtles have been around for millions of years and have persisted through dramatic changes in past climates, demonstrating their ability to adapt to changing conditions [20, 64], by: 1) changing the distribution of their nesting grounds, nest site choice, and nest depth; 2) adapting in situ by adjusting their pivotal temperature; and 3) shifting their nesting to cooler months of the year [21, 65–70]. It is suggested that range shifts may offer one of the most promising avenues for adaptation in marine turtles [62, 64] since earlier nesting and changes in nest-site choice can quickly offset and counteract projected impacts to species with temperature-dependent sex determination [4, 71, 72]. Range shifts have already been observed for leatherback and loggerhead turtles as response to warming temperatures [69, 73, 74].

Unfortunately, the future adaptive capacity of sea turtles may be hindered by the reduction of available nesting grounds from rises in sea-levels and the ever-expanding development along coasts [75–77]. Thus, management efforts should focus on ensuring that nesting grounds are available to increase the resilience of sea turtle populations to climate change [78, 79]. This can be achieved by protecting nesting beaches (i.e. conservation easements, reducing coastal development, enforcing wildlife laws and regulations), limiting and regulating development (i.e. implementing setback regulations), and by maintaining the nesting habitat (i.e. maintain native vegetation, minimize the use of shoreline hardening structures) [54, 77, 79–81]. The climate models presented here offer a great starting point to understand local resiliency, however
a better understanding of the synergistic effects of climate as well as non-climate threats is need to improve our understanding of how species will be impacted by projected climate change.

Supporting information

S1 File. Supporting information including statistics results and other measures. Distances of INMET weather stations from nesting grounds in each region considered in this study, from north to south (Table A). Nest and climate data availability for each region between 2005–2016 included in our analyses. The typical nesting season in RN occurs between November–May, while the typical nesting season in BA occurs between October–April (Table B). Results of Tamhane’s T2 test for statistical differences in hatching success and emergence success between nesting beaches within Rio Grande do Norte (RN) and Bahia (BA), Brazil, from north to south. Statistically significant p–values are indicated in bold (Table C). Results of Generalized Linear Mixed-Effects Models for local climate influences on hatching success (HS) and emergence success (ES) across Brazil as well as within Rio Grande do Norte (RN) and Bahia (BA). For these models, the binomial family was specified, and the year nests were laid was the random effect. Model parameters included: average air temperature (temp), accumulated precipitation (acc.rain), average precipitation (avg.rain), average humidity (humid), average solar radiation (rad) and average wind speed (wind). The temporal scales used were: the month nests were laid (0.climate variable), the month nests were laid and one-month prior (0.1.climate variable), the month nests were laid and two months prior (0.2.climate variable), two months prior to nesting (2.climate variable), and during the incubation period (inc.climate variable). The models with the lowest AICc values and high significance are highlighted in gray. P–values for combined models are presented for each parameter in the order the model is written (Table D).

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