

Original Article

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Change detection in a Marine Protected Area (MPA) over three decades on Bonaire, Dutch Caribbean

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Abstract

The island of Bonaire is a long-established Marine Protected Area (MPA), the reefs of which were extensively mapped in the early 1980s. Satellite remote sensing techniques were used to construct reef maps for 2008–2009. Metrics describing the spatial structure of coral habitat at the landscape scale – including coral cover, fragmentation, patch size and connectivity between patches – were calculated and compared between these two time periods. Changes were evaluated in and out of the MPAs and in areas exposed and sheltered from storm damage. Overall, coral cover has declined during the past three decades, being replaced by sand, but the decline has not been as drastic as elsewhere in the Caribbean. Fragmentation of the reef habitat has occurred, resulting in smaller and more disparate patches, but these changes were not associated with exposure along the coastline. However, total coral cover was maintained in sheltered areas, whereas it declined along exposed shorelines. Human protection of reefs by marine reserves had variable effects on coral cover and fragmentation. One of two no-diving marine reserves showed increases in coral cover accompanied by decreases in the number of patches of coral and an increase in the size of individual patches over the time period, while the second reserve exhibited the opposite trend. Advances in satellite remote sensing techniques allow for a more rapid assessment of changes in reefs at the landscape level, which can be used to identify spatial changes in the reef environment, including areas of coral decline.

Introduction

Understanding the spatial distribution of species and habitats at multiple spatial scales is of central importance to ecology (He & Legendre, 2002; Harte *et al.*, 2005). Patterns in the distributions of species and habitats across space provide information critical to our ability to interpret the forces that structure and maintain ecological diversity (Gaston & Blackburn, 2000), particularly over time (Gardner *et al.*, 2003). There is evidence that the spatial integrity of key habitats at the landscape scale is important for the continued success of conservation areas in a changing world (Saunders *et al.*, 1991; Opdam & Wascher, 2004), with both habitat loss and habitat fragmentation being of concern. Fragmentation is more than just the loss of habitat, but loss such that small, isolated patches are created, changing the properties of the remaining habitat (van den Berg *et al.*, 2001). In coral reef environments, many studies have investigated temporal changes in fine-scale patterns in reef structure (e.g. Bak *et al.*, 2005) or regional patterns (Gardner *et al.*, 2003), but few have investigated mesoscale change, at the scale of landscapes (~hundreds of m to tens of km; Turner *et al.*, 2003). It is crucial, as we are experiencing worldwide declines in coral reef habitats, to understand how local, regional and global impacts combine to affect the reef's structure.

The island of Bonaire, Dutch Caribbean, represents a unique, long-established Marine Protected Area (MPA). The Bonaire Marine Park (BMP) was established in 1979, after a series of other marine conservation measures, including increasing protection for turtles (1961), prohibitions on spear fishing (1971) and protection for corals, living or dead, from removal, damage by anchor dropping, and contact from divers (1975). In 1991 two marine reserves were simultaneously established that excluded underwater visitors, and the BMP was given full protection out to the 60 m depth contour. In 1999, the BMP gained national status as a park of the Netherlands Antilles and became the Bonaire National Marine Park (BNMP). Owing, at least in part, to the long-term protection they have received, the reefs of Bonaire are thought to be amongst the most 'pristine' coral reef environments in the Caribbean (Stokes *et al.*, 2010).

In 1985, Dr Fleur van Duyl published the *Atlas of the Living Reefs of Curaçao and Bonaire (Netherlands Antilles)*, comprehensively mapping the coral reefs off the leeward coasts of Bonaire and Curaçao, an island to the west of Bonaire (Figure 1). The map classified the subtidal substratum into dominant benthic community types out to 10 m depth based on data collected by low-altitude aerial photography and ground-truthed extensively by scuba diving in the early 1980s. Van Duyl (1985) found coral to be the dominant bottom-type, making up around 62% of the benthos off the leeward side of Bonaire in shallow water (<10 m). The total amount of coral cover was made up of nearly 40% *Acropora cervicornis* and 40%



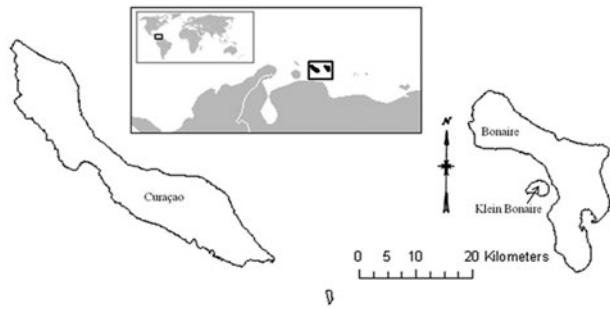


Fig. 1. The islands of Bonaire and Curaçao are located in the Dutch Caribbean, about 80 km north of Venezuela.

head coral, with the most common head corals being *Montastraea annularis*, *M. cavernosa*, *Diploria strigosa*, *Siderastrea siderea*, *S. radians*, *Dichocoenia stokesii*, *Colpophyllia natans*, *Porites astreoides*, *Meandrina meandrites* and *Stephanocoenia intersepta*. Head corals in this group were sometimes accompanied by the foliate *Agaricia* spp. and finger corals were often present in this group (van Duyl, 1985). Since van Duyl's work was completed, cover of *A. cervicornis* has dropped to nearly zero, but increases in the head coral group have occurred at various locations along the coast (Relles & Patterson, unpublished).

Satellite remote sensing has proven to be an effective technique for creating benthic habitat maps in coral ecosystems at coarse habitat resolution (3–4 bottom-type classes) and less than 20 m deep (Mumby *et al.*, 1997, 1998; Mishra *et al.*, 2006; Relles *et al.*, 2012). Temporal change detection techniques (Jensen, 2005) can then be employed to compare changes in coral cover, or other substrata of interest, on a pixel-by-pixel basis, while computing total changes at the landscape level. The advantage of satellite remote sensing combined with change detection techniques is that total loss vs fragmentation can be rapidly quantified. Because fragmentation is a landscape-level process, fragmentation measurements are correctly made at the landscape scale (McGarigal *et al.*, 2002; Fahrig, 2003), but this has rarely been done on coral reef habitats. Decreases in patch size and increases in the isolation of patches lead to reductions in population connectivity and are of particular concern for small reef-dwelling organisms with limited adult ranges and could potentially affect reproduction or dispersal (Schroeder, 1987). Coral reefs, like most habitats, offer a number of advantages to their denizens, including protection from predation and a location to forage and find mates. The complex structure of coral reefs provides the physical habitats and shelter sites that accommodate many size classes of associated organisms. The ability to make landscape-level maps of coral cover is important for conservation efforts and of particular interest to government officials and Marine Protected Area (MPA) managers. Coastal habitat maps are a fundamental requirement in establishing coastal management plans for systems like coral reefs (Cendrero, 1989; Relles *et al.*, 2012).

In this study, a recent (2008–2009) satellite-derived map of the reefs of Bonaire (Relles *et al.*, 2012) is compared to the habitat maps (van Duyl, 1985) from data collected in the early 1980s to identify areas of coral habitat loss and reef fragmentation. The changes in the spatial structure of these coral habitats between the two time intervals are described at the landscape scale using metrics of cover of coral and sand cover, fragmentation, patch size and connectivity between patches. These changes were evaluated in areas within the no-diving marine reserves and comparably sized unprotected sites to determine whether the lack of underwater visitors has had a significant positive impact on coral cover. The changes in reef structure associated with broad-scale disturbance from storms are also assessed by comparing

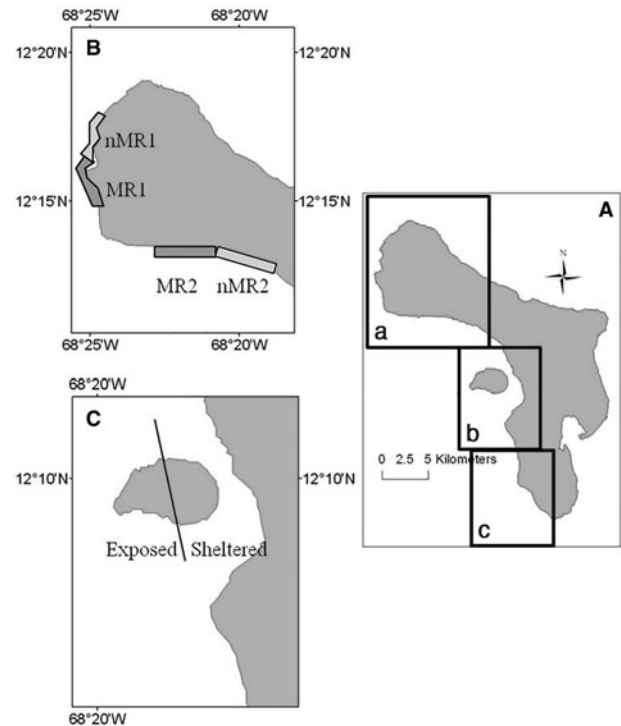


Fig. 2. The outline map (A) shows the entire island of Bonaire and neighbouring island of Klein Bonaire. The north-west coast of the island (a), the central coast (b), and the southern coast (c) are inset. The locations of the exposed (MR1) and sheltered (MR2) marine reserves and adjacent exposed (nMR1) and sheltered (nMR2) non-reserve sites (B). Klein Bonaire showing the sheltered and exposed sides of the island (C).

areas exposed to and sheltered from predominant tropical cyclone tracks. This study complements previous research conducted at a finer-scale, from line transects and quadrats (Bak *et al.*, 2005; Steneck *et al.*, 2011).

Materials and methods

Baseline data

The island of Bonaire is located in the southern Caribbean Sea, ~80 km off the coast of Venezuela (12°10'N 68°17'W; Figure 1). This study focuses on the reefs off the leeward coast of Bonaire, including the accompanying uninhabited island to the west, Klein Bonaire (Figure 2). Maps of dominant coral community type and other bottom-types (e.g. sand, rubble, shore zone and marine plants) were mapped in the early 1980s using aerial photographs and scuba diving to a depth of 10 m (van Duyl, 1985). As an ancillary data source there is significant potential for error in the van Duyl (1985) dataset. The maps were created from aerial photographs taken from variable altitude and the scale of the photographs fluctuated. The maps were then constructed using the most recent base maps available at the time, which were from 1963 (van Duyl, 1985). The atlas was digitized into images (TIFF format) and subsequently georectified using ArcGIS 9.3 (ESRI, 2010). To align the maps with the coast on the satellite images, between 12 and 18 control points were identified using the georeferencing tool in ArcGIS, which allowed features identified by van Duyl (1985) to be aligned to the satellite images (e.g. distinct terrestrial features of coastal morphology, piers and other permanent structures). Based on the control points, ArcGIS was used to compute spatial residual error values, a measure of the fit between the true location on the image itself and the transformed locations of the output control points. Control points with the highest levels of error were then removed

Table 1. Van Duyl's classifications on the left reclassified into the coarser classification system discernible by the satellite remote sensing method for the 2008–2009 maps. Coral cover greater than 20% (van Duyl, 1985) was classified as coral under the coarser classification system and sand cover greater than 50% (van Duyl, 1985) was classified as sand.

van Duyl's class	Coarse class system
Sea whip	Sand/Coral
<i>Acropora cervicornis</i> (>20%)	Coral
<i>Acropora palmata</i> (>20%)	Coral
Finger/Foliate coral group (>20%)	Coral
Head coral group (>20%)	Coral
<i>Acropora cervicornis</i> (<20%)	Sand/Coral
<i>Acropora palmata</i> (<20%)	Sand/Coral
Finger/Foliate coral group (<20%)	Sand/Coral
Head coral group (<20%)	Sand/Coral
Plant	Sand/Coral
Rubble	Sand
Sand	Sand
Shorezone	Sand

until the total root mean square error (RMSE), a statistical measure of the magnitude of variability between the shape of the original file and the shape of the georectified file, was less than 9, without dropping the total number of control points below six. The resulting benthic habitat maps were saved as raster files. Van Duyl's (1985) 30 maps of Bonaire's leeward reefs varied with respect to the presence of distinctive features to identify along the present coastline in the satellite images and therefore in the number of useful control points and this is a potential source of error in the resulting raster datasets. Polygon vector shapefiles were drawn manually around each of van Duyl's original bottom-types using the editor function of ArcGIS 9.3 (ESRI). After creation of these polygons based on the van Duyl (1985) maps, bottom-types were reclassified into the coarser class distinctions of coral, sand and sand/coral to match the discrimination capabilities of the satellite remote sensing techniques (Table 1). The polygons were then converted to raster files at a resolution comparable to the satellite imagery. While van Duyl mapped areas of coral with per cent cover ranging from 10–20, 20–40 and >40%, satellite data were coarsely classified as coral if they contained greater than 20% coral cover. For this reason, areas considered to be 10–20% coral by van Duyl's classification were included in the sand/coral mixture class.

Satellite-derived data ground-truthed from scuba surveys and CPCe

Three multi-spectral, high-resolution (2.4 m pixel) images from the QuickBird (QB) satellite acquired in 2008 and 2009 along the leeward coast of the island of Bonaire, including the small, uninhabited neighbouring island of Klein Bonaire, were prepared and analysed to create benthic habitat maps. This required a first-order atmospheric correction, which removed the scattering effects of light and other electromagnetic radiation by particles smaller than the wavelength of light (Rayleigh scattering) and the scattering of radiative energy by processes at the aerosol and molecular level, particles larger than the wavelength of light. The effects of variable depth were accounted for using the model derived by Lyzenga (1978, 1981), Mumby *et al.* (1997) and Mishra *et al.* (2006) in order to remove water column

attenuation effects. Tidal stage at the time of acquisition of the satellite images was insignificant; Bonaire has a micro-tidal range, with a mean tidal range of around 10 cm (Kjerfve, 1981). As a result, any tidal variation between datasets used in this study were within our observational measurement error. Estimating the bathymetry allowed the effects of particulates and chlorophyll in the water, as well as bottom albedo, to be removed from the imagery (detailed in Relles *et al.*, 2012). After these corrections, an image of the remote sensing reflectance from the bottom comprised of three bands (red, blue and green) was analysed using the computer program ERDAS® Imagine. The Iterative Self Organizing Data (ISODATA) algorithm was used to perform an unsupervised classification of the benthos into 10 classes based on the optical properties of the pixel (Jensen, 2005; Mishra *et al.*, 2006). Those classes were then named and grouped together based on the dominant benthos found in each, which was ascertained by visual scuba surveys collected in January 2008. Seventeen underwater video transects were collected along the leeward coast out to a depth of 20 m and analysed as individual screenshots using the program Coral Point Count with Excel® Extensions (CPCe; Kohler & Gill, 2006). These groupings resulted in three coarse classes: sand, coral and a sand/coral mixture (Relles *et al.*, 2012), which were then used to perform a supervised classification of the benthos. QB imagery has proven useful for such coarse classifications (3–4 classes) in coral reef habitats (Mishra *et al.*, 2006). Details on the algorithms for atmospheric and water column corrections, as well as the classification system, are described extensively in Relles *et al.* (2012). The coral class included areas where live hard coral cover was greater than 20%, while the sand class had greater than 50% sand cover, generally the rest of the area was covered in the exposed calcium carbonate skeleton. The sand/coral mixture class contained some mixture of less than 20% hard coral and less than 50% sand with the additional cover attributed to the presence of octocorals, various marine plants, including *Sargassum* spp., or dead coral with algae based on video collected by scuba.

Several types of metrics can determine the accuracy of a classification; overall accuracy is simply the sum of correctly labelled test sites divided by the total number of test sites, while user accuracy is the probability that a classified pixel actually represents that category on the ground (Mumby *et al.*, 1997). The overall accuracy of the classification system used here was 71%, with a user accuracy for the sand class of 94% and a user accuracy for the coral class of 50%. The lower level of user accuracy for the coral class is a potential source of error in the classification system for the satellite-derived 2008–2009 data set and could potentially result in a coral pixel being mislabelled as sand. Using this system a total of 6.8 km² of reef along more than 50 km of leeward coastline was mapped out to a depth of ~10 m.

Harmonization of data

Prior to comparison of the two data sets (i.e. 1980s and 2008–2009), it was necessary to adjust the spatial resolution such that both data sets had the same resolution as the lowest resolution data set; in this case van Duyl (1985). The minimum mapping unit (MMU), which represents the minimum size of a polygon delineated by van Duyl (1985), and presumably the smallest habitat area discernible in the aerial photographs used to create the maps, was 9 m × 9 m (81 m²). The classified 2008–2009 satellite images were then down-resolved from their original 2.4 m × 2.4 m pixels (5.76 m²) by resampling the 2.4 m pixels into 9.6 m pixels using a majority rule. This resampling is a potential source of error as the 2.4 m pixels in the satellite data set were down-resolved to 9.6 m, the majority rule of resampling potentially

Table 2. Change values calculated in ArcGIS representing changes in bottom type between the early 1980s and 2008–2009, distinguishing positive, negative and no change.

Value	Change (from-to)	Change (type)
11	Coral to Coral	None
12	Sand/coral to Coral	Positive
13	Sand to Coral	Positive
21	Coral to Sand/coral	Negative
22	Sand/coral to Sand/coral	None
23	Sand to Sand/coral	Positive
31	Coral to Sand	Negative
32	Coral/sand to Sand	Negative
33	Sand to Sand	None

causes a pixel that is coral to change to sand if the majority of pixels in the resampling area are sand. The same is true for a sand pixel surrounded by coral, but the down-resolving is necessary for change detection comparisons between the two data sets.

Change detection

The categories of coral, sand/coral and sand were represented numerically as 1, 2 and 3, respectively in the van Duyl data set, hereafter referred to as 1980s; and 10, 20 and 30, respectively, for the satellite data set, hereafter referred to as 2008–2009. Because of this coding convention, progression from the ones column to the tens column of the resulting sum would represent the change in bottom-type from the 1980s to 2008–2009 (Table 2). Changes were quantified as positive, negative or neutral/no change. Change was considered positive when a pixel that was something other than coral changed to coral. It was also considered positive when an area previously dominated by sand became an area of sand/coral mixture. Negative changes occurred when coral changed to anything that was not coral, including when an area of sand/coral mixture changed to exclusively sand.

Patch dynamics

Raster data for both years were analysed using FragStats 3.3 (McGarigal *et al.*, 2002), which calculated patch, class and landscape metrics. A patch is defined as an area of similarly-classified pixels, using an eight-cell rule that takes into consideration all eight adjacent cells, including the four orthogonal and four diagonal neighbours, to determine patch membership. The classes in this case were coral, sand and sand/coral mixture, as described above. In addition to calculating the number and size of patches, including total patch area and perimeter-to-area ratios (PARA), two indices of connectivity between patches were also calculated: a contiguity index (CONTIG) and the Euclidean Nearest Neighbour (ENN) distance. Contiguity is quantified in FragStats by convolving a 3×3 pixel template with a binary digital image in which the pixels within the patch of interest are assigned a value of 1 and the background pixels (all other patch types) are given a value of zero. Template values of 2 and 1 are assigned such that orthogonally contiguous pixels are weighted more heavily than diagonally contiguous pixels; the contiguity value for a pixel is the sum of the products of each template value and the corresponding input image pixel value within the nine cell neighbourhood. Contiguity values range between zero and 1, with large contiguous patches resulting in larger values, as opposed to smaller, more disparate patches (McGarigal *et al.*, 2002). The isolation

of patches of coral was measured using the ENN approach, the shortest straight-line distance between the focal patch and its nearest neighbour of the same class (McGarigal *et al.*, 2002), which hereafter will be referred to as connectivity of the reef habitat. Patch, class and landscape metrics for the two data sets, 1980s and 2008–2009, were compared statistically using an ANOVA when the data were normally distributed and the Mann–Whitney Rank Sum Test and Kruskal–Wallis non-parametric test when the data were not normally distributed.

No-diving marine reserves

The farthest north-west marine reserve closed to divers was designated marine reserve number one (MR1) and was considered an exposed site because its position along the coastline left it potentially more exposed to storms. A comparable site of equal size and adjacent to MR1 was identified as nMR1 and considered to be an exposed site in a similar area along the coast that was not closed to divers and other underwater visitors. The second marine reserve is located farther south along the coast and is sheltered by the north-western portion of the island and was designated MR2. A comparable site of equal size to the east of MR2 was designated as the non-reserve, sheltered site, nMR2. MR1, nMR1, MR2 and nMR2 are shown in Figure 2B. These four sites were compared to look at the patch statistics described above and compare marine reserve to non-reserve, exposed *vs* sheltered sites, and the earlier, 1980s data to the 2008–2009 satellite data. The Mann–Whitney Rank Sum Test was used to determine which year, exposure, and marine reserve status combinations were significantly different from one another in terms of connectivity; because there were 21 pairwise comparisons of the seven combinations (only one patch in MR1 in the early 1980s, therefore no ENN value) the alpha level of significance was adjusted accordingly by dividing it, 0.05, by 21, resulting in an α of 0.0024 (Bonferroni adjustment).

Klein Bonaire coastline exposure

The small island of Klein Bonaire, located just west of the main island of Bonaire, is uninhabited. The western portion of the island is exposed to incoming waves and storm energy, while the eastern portion is sheltered by the main island. The island was divided into exposed and sheltered (Figure 2C) and the two halves were statistically analysed to compare the patch statistics described above for the exposed *vs* sheltered halves between the 1980s and 2008–2009.

Results

Baseline reef environment

In the early 1980s, 707 hectares of reef offshore of the leeward coast of Bonaire was mapped (van Duyl, 1985). Sixty-two per cent of this area represented greater than 20% hard coral cover at the time (441 ha), while areas of high sand cover (>50% sand) made up almost 32% (226 ha). The remaining 6% was composed of a sand/coral mixture (40 ha), which included soft corals, as well as dead coral covered with algae, and other marine plants.

Current reef environment

In 2008–2009, 695 hectares of the 707 hectares of reef that were mapped in the early 1980s were remapped using satellite remote sensing techniques; the disparity in area mapped was a result of cloud cover in the satellite images. Slightly greater than 30% of the 92.2 m^2 pixels represented areas of greater than 20% hard

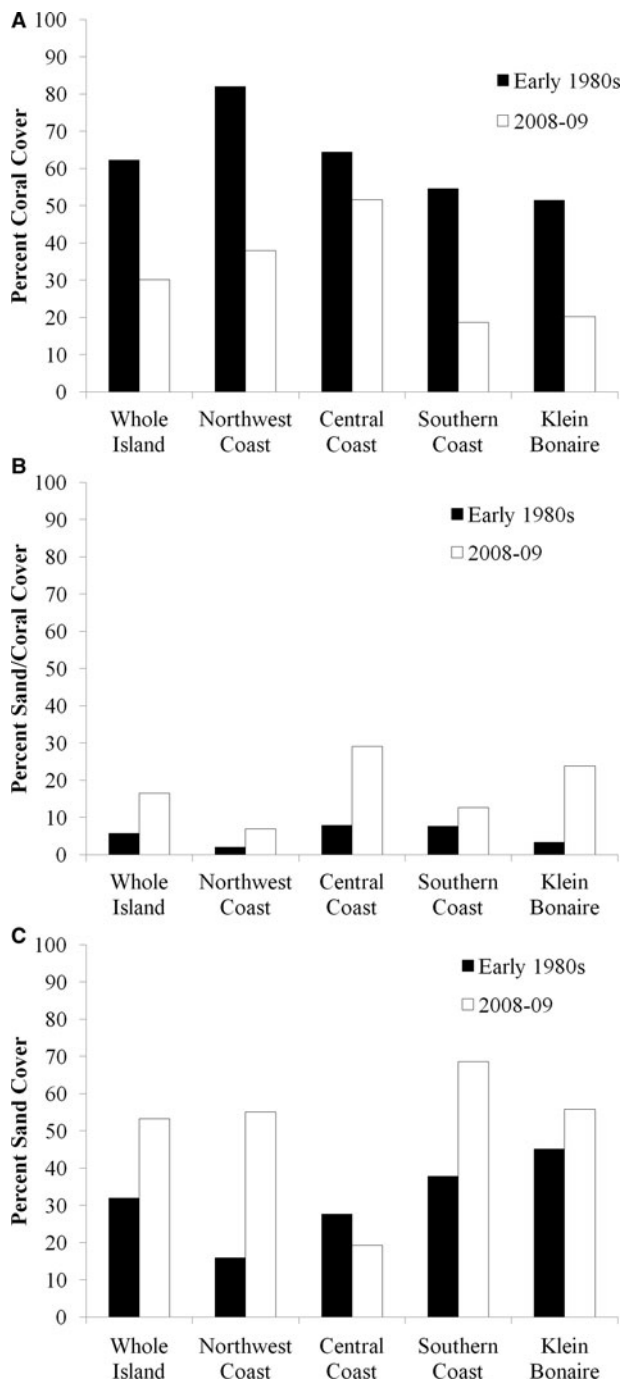


Fig. 3. Changes in per cent coral cover (A), sand/coral mixture (B) and sand (C) between the early 1980s (black) and 2008–2009 (white) on the entire leeward coast of the island of Bonaire, the north-west coast, the central coast, the southern coast, and the uninhabited island of Klein Bonaire.

coral cover (210 ha). Sandy bottom (>50% cover) dominated 53% of the reef, ~370 ha, while the remaining 17% of the reef (115 ha) was covered by a sand/coral mixture, often accompanied by octo-corals (e.g. sea whips and gorgonians), dead coral covered with algae, and marine plants.

Changes in the reef environment

Considering the leeward coast in its entirety, areas of no change made up 45% of the total reef area and negative change occurred on 43% of the total area, while areas of positive change were only found in 12%. For areas previously dominated by coral, 47% became sand, while 36% stayed coral. The largest percentage of

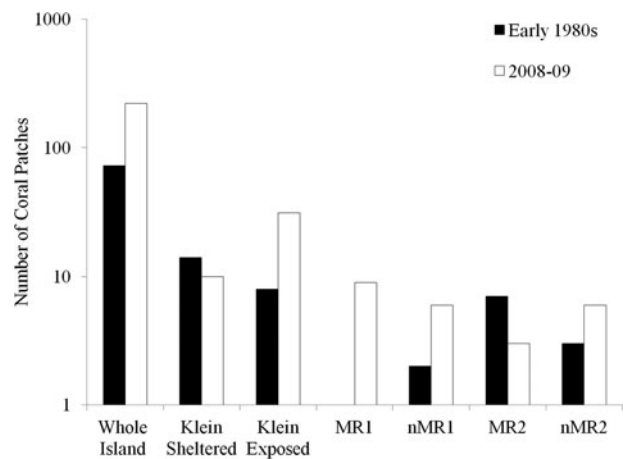


Fig. 4. Changes in the number of coral patches between the early 1980s (black) and 2008–2009 (white) off the leeward coast of the main island, on the sheltered and exposed sides of Klein Bonaire, and in the marine reserves and adjacent non-reserve sites. Note: log scale is used and only one coral patch in the early 1980s in the no-entry marine reserve 1 (MR1).

sand pixels from the 1980s data set remained sand in 2008–2009 (66%), while 18% became coral and 15% changed to a sand/coral mixture. The largest percentage of the sand/coral mixture pixels changed to sand in 2008–2009 (43%), 24% remained sand/coral, while 34% changed to coral.

The north-west coast, most of which is uninhabited because it includes Washington Slagbaai National Park (Figure 2A), experienced the highest area of negative change (51%), with 60% of coral pixels changing to the sand/coral mixture class or to just sand. While 82% of the area was represented by coral in the 1980s (133 ha), coral dropped to 38% of the area in 2008–2009 (61 ha; Figure 3A), and the area of sand increased from 16% (26 ha) to 55% (89 ha; Figure 3C). The sand/coral mixture class experienced an increase from 2% (3 ha) to 7% (11 ha) from the early 1980s to 2008–2009 (Figure 3B).

The coast of the central part of the island (Figure 2B), which includes one of the no-diving marine reserves (MR2) and the capital city (Kralendijk), extends 16 km along the coastline to the north of the city, experienced the highest level of positive change (33%) and the lowest level of negative change (26%) of the four areas. A larger portion of this coastal area was coral in the early 1980s (64%) than in 2008–2009 (52%; Figure 3A). The sand/coral mixture increased from 8% in the early 1980s to 29% in 2008–2009 (Figure 3B). Correspondingly, the amount of sand cover in the area declined from 28% to 19% (Figure 3C).

The southern coast is also sparsely inhabited and consists mostly of salt pans for the island's sea salt industry (Figure 2C). In the early 1980s, 55% of this portion of the coastline was covered in coral (158 ha), which dropped to 19% in 2008–2009 (52 ha; Figure 3A). Correspondingly, sand cover increased from 38% (109 ha) to nearly 70% (190 ha; Figure 3C).

The uninhabited island of Klein Bonaire, located ~1 km west of Bonaire, experienced declines in coral cover from 52% (59 ha) to 20% (23 ha) over the time period (Figure 3A). Thirty-four per cent of the coral pixels changed to sand, while 35% changed to the sand/coral mixture, resulting in an increase in the sand/coral mixture class from 3% (4 ha) to 24% (27 ha; Figure 3B), and the sand class from 45% (51 ha) to 56% (63 ha; Figure 3C).

Whole island patch dynamics

While the total percentage of area covered by coral declined from 62% in the 1980s to 30% in 2008–2009 (Figure 3A), the number of patches of coral increased from 72 to 221 (Figure 4). Mean

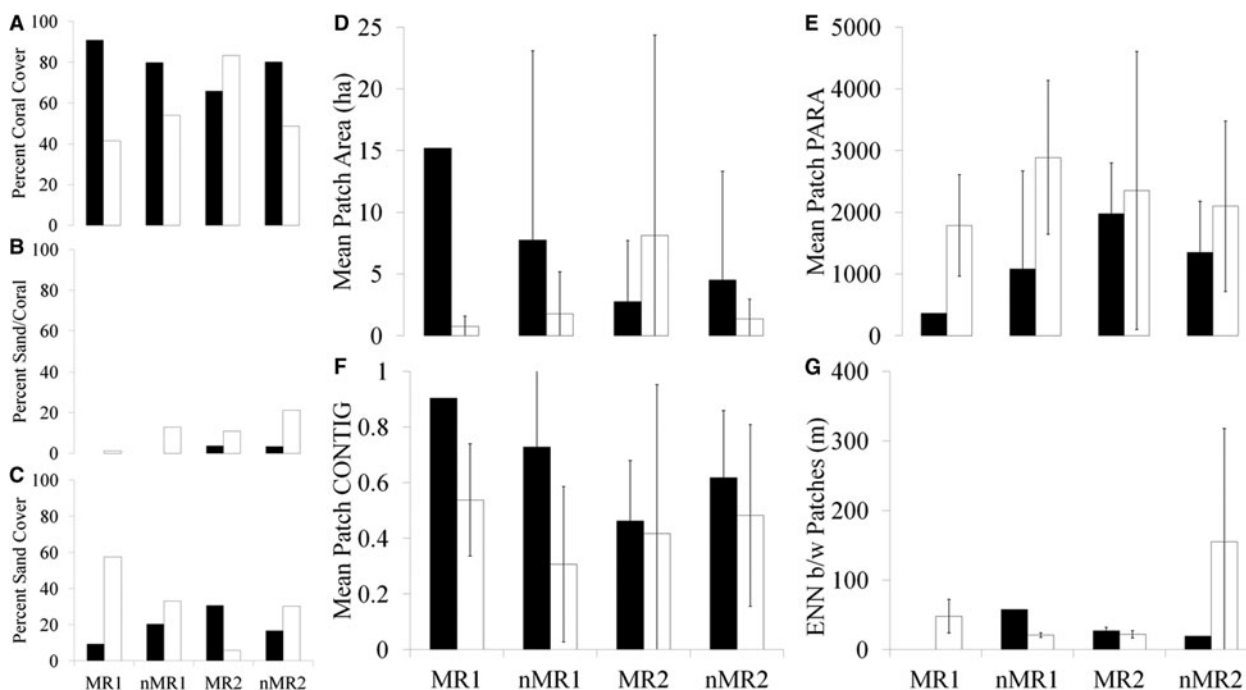


Fig. 5. Changes in per cent coral cover (A), sand/coral mixture (B) and sand (C) between the early 1980s (black) and 2008–2009 (white) in the two marine reserves (MR1 and MR2) and unprotected adjacent areas (nMR1 and nMR2) on Bonaire. Note: there was no sand/coral mixture class in MR1 or nMR1 in the early 1980s. Changes in the patch parameters area (D), PARA (E), contiguity index (F) and ENN distance (G) between the early 1980s (black) and 2008–2009 (white) in the two marine reserves (MR1 and MR2) and unprotected adjacent areas (nMR1 and nMR2) on Bonaire.

patch size decreased from 6.12 ha to 0.95 ha ($U_{221,72} = 6035.00$, $P = 0.002$). The PARA increased from 2247.87 to 2827.34 ($U_{221,72} = 5838.50$, $P < 0.001$). The contiguity decreased from 0.41 to 0.30 ($U_{221,72} = 5959.50$, $P = 0.001$). The connectivity values were not significantly different between years.

No-diving marine reserves

Out of the four areas, MR1, MR2, nMR1 and nMR2, only the sheltered, no-diving reserve site (MR2) experienced a positive increase in coral cover over the time period, going from 66% coral to greater than 83% (Figure 5A). This was accompanied by a decline in sand from 31% in the early 1980s to 6% in 2008–2009 (Figure 5C). MR1, nMR1 and nMR2 all experienced declines in coral cover and increases in sand (Figure 6). MR2 is the only site that experienced a decrease in patchiness within the reserve over time (Figure 4), which was accompanied by increases in the mean patch area and PARA (Figure 5D & 5E). MR1, nMR1 and nMR2 all experienced increases in the number of patches (Figure 4) and decreases in mean patch area (Figure 5D), but mean PARA increased in all three (MR1, nMR1 and nMR2; Figure 5E). All four areas experienced declines in contiguity (Figure 5F). Mean connectivity values decreased in MR2 and nMR1, but increased in nMR2 (Figure 5G). In the early 1980s, there was only one large coral patch in MR1 so there is no connectivity value. Patch PARAs and contiguity were not significantly different as a result of year, exposure, status as a marine reserve or any combination of the three (Table 3). The mean patch area was not significantly impacted by year, exposure or status as a marine reserve. Connectivity was significantly different between the groups ($H = 16.68$, $df = 6$, $P = 0.01$, adjusted for ties). In the early 1980s, the connectivity of the non-reserve, exposed site was significantly higher than the sheltered reserve site in the early 1980s (t -test = -5.79 , $df = 7$, $P < 0.001$) and in 2008–2009 (t -test = -10.446 , $df = 3$, $P = 0.002$).

Effect of exposure on Klein Bonaire

From the early 1980s to 2008–2009, the sheltered, eastern portion of Klein Bonaire declined from 37% coral to 27% (Figures 7A & 8). Between the two time periods the sand/coral mixture class increased from 6% of the total area to 19% (Figure 7B), while sand declined slightly from 57% to 54% (Figure 7C). The exposed, western side of Klein Bonaire initially had a higher percentage of coral cover than the eastern side (63%), which declined to less than 15% in 2008–2009 (Figures 7A & 8). This was accompanied by an increase in sand from 35% to 57% and an increase in the amount of area covered by a sand/coral mixture from 1.5% to 28% (Figure 7B & 7C). The exposed side of the island increased in the number of patches of coral from 8 to 31, whereas the sheltered side of Klein experienced a decline in the number of coral patches from 14 to 10 (Figure 4).

Between the two time periods, only connectivity was significantly different on the exposed side of the island ($U_{31,8} = 50.5$, $P = 0.01$; Figure 7G). There was no significant effect of year or exposure on patch area (Figure 7D), PARA (Figure 7E) or contiguity (Figure 7F). Connectivity was significantly different between the habitat groups ($H = 7.99$, $df = 3$, $P = 0.05$, adjusted for ties), although, after Bonferroni adjustment (for six pairwise comparisons of the four habitats: $\alpha = 0.0083$), pairwise comparison (Mann–Whitney Rank Sum Test) found none of the combinations of year and exposure to be significantly different.

Discussion

Using satellite remote sensing techniques to determine coral cover on the shallow reefs of Bonaire (less than 10 m) and comparing it to the atlas created by van Duyl in the 1980s, coral has declined from 62% to only 30% over the time period. However, Bonaire's reefs are experiencing less severe declines in coral cover than elsewhere in the Caribbean, which have seen declines from about 50% to 10% hard coral cover in three decades (Gardner *et al.*, 2003;

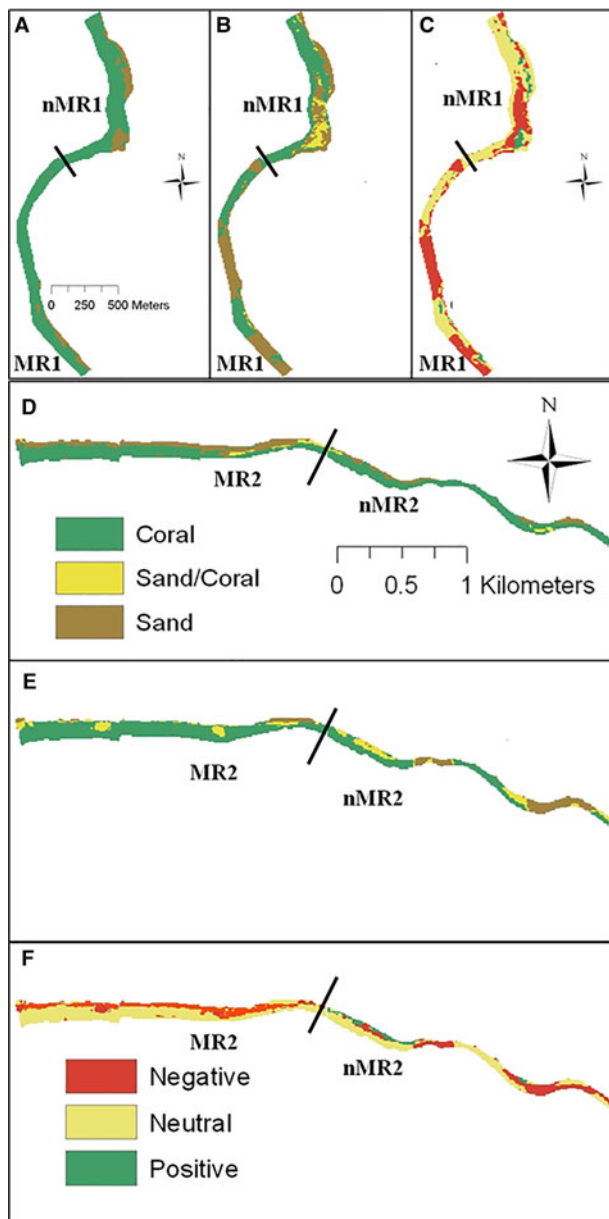


Fig. 6. Coral, sand/coral mixture and sand classes in the exposed MR1 and nMR1 in the early 1980s (A) and 2008–2009 (B). The negative, neutral and positive change values over the time period in MR1 and nMR1 (C). Coral, sand/coral mixture, and sand classes in the sheltered MR2 and nMR2 in the early 1980s (D) and 2008–2009 (E). The negative, neutral and positive change values over the time period in MR2 and nMR2 (F).

Jackson *et al.*, 2014). Our findings on current coral cover using remote sensing techniques (30%) are similar to findings by Steneck *et al.* (2011, 2015), who reported 34–39% live cover at quadrats in 10 m of water off the leeward coast of Bonaire and to Stokes *et al.* (2010) who reported coral cover ranging from 23.7–38.4% at depths between 10 and 30 m. Bak *et al.* (2005) reported ~20% coral cover within permanent quadrats at 10–20 m depth on Bonaire. Jackson *et al.* (2014) reported coral cover on Bonaire to be 31% at 10 m depth, which was a decrease of 32% between 1974 and 2008. At 20 m depth cover was much lower, 8%, a decrease of 63% between the same years (Jackson *et al.*, 2014). Areas of previously high coral cover examined here were replaced mostly by sand and the remaining coral has become increasingly patchy, with a greater number of small, less contiguous coral patches. The data for van Duyl (1985) was collected in the early 1980s, prior to the die-off of large acroporids, which occurred on Bonaire in 1983 (Knowlton *et al.*, 1981; Jackson

Table 3. *F*-stats and *P*-values resulting from a three-way ANOVA with year, exposure and marine reserve status as predictors for the variables PARA and CONTIG (df = 29).

	PARA		CONTIG	
	<i>F</i>	<i>P</i>	<i>F</i>	<i>P</i>
Year	3.63	0.07	3.07	0.09
Exposure	0.53	0.47	0.81	0.38
Reserve	0.17	0.69	0.12	0.74
Year × Exposure	0.86	0.36	1.20	0.28
Year × Reserve	0.11	0.74	0.07	0.80
Exposure × Reserve	1.40	0.25	1.29	0.27
Year × Exposure × Reserve	0.00	1.0	0.00	0.95

et al., 2001, 2014). On Bonaire rubble created from the broken calcium carbonate of *Acropora palmata* and *A. cervicornis* is clearly visible, particularly in the shore zone and shallow reef (<5 m). However, in contrast to other regions in the western Atlantic, Bonaire has not been severely damaged by hurricanes in recent times (Bries *et al.*, 2004), but when hurricanes do occur in the region the normally calm leeward coast can experience higher wave energy (van Duyl, 1985; Pandolfi & Jackson, 2001). In 1999 hurricane Lenny moved in a rare west-to-east direction across the Caribbean, resulting in coral toppling, fragmentation, tissue damage, bleaching and smothering along the coast of Bonaire (Bries *et al.*, 2004). A subsequent study comparing QB satellite images from the years before and after Lenny could measure the impact of this specific storm on coral cover. Fortunately, Bonaire has not seen an overgrowth of macroalgae in areas where coral has been lost and replaced by sand and rubble (Kramer, 2003; pers. obs.), as has been documented elsewhere in the Caribbean (Bellwood *et al.*, 2004; Bruno *et al.*, 2009).

Although most of the reef experienced declines in coral cover, a non-negligible 16% of the reef did experience positive changes toward higher coral cover, and a large amount, 40%, remained unchanged between the early 1980s and 2008–2009. It was initially surprising to the authors that the largest amount of increase in coral cover was concentrated along the middle of the leeward coast, where the capital city of Kralendijk is located and most of the population resides. In contrast, the much less inhabited northern and southern leeward coasts experienced higher levels of negative change. The authors expected more negative impacts to be concentrated around the population centre owing to nutrient inputs, sedimentation and runoff as a result of development. A possible reason these negative impacts were not found where expected is that mapping by van Duyl (1985) may have occurred after damage had already taken place as a result of rapid building and development of the capital city of Kralendijk. In addition, this area of coastline is sheltered by the neighbouring island of Klein Bonaire and the adjacent shore of Klein Bonaire, which is sheltered by the main island, was also not found to have experienced as drastic a decrease in coral cover when compared to the exposed side of Klein Bonaire; it became less patchy over the time period, with fewer, but larger patches of coral, suggesting that protection of the coastline may be helping to buffer coral losses and fragmentation. The fact that the sheltered marine reserve and sheltered side of Klein Bonaire both experienced decreases in the number of coral patches and increases in patch area supports the hypothesis that status as a marine reserve and sheltering from exposure may buffer against coral fragmentation. Surrounding Klein Bonaire the majority of coral loss was in the shallower portions of the reef, along the shoreline (Figure 8). Elsewhere, long

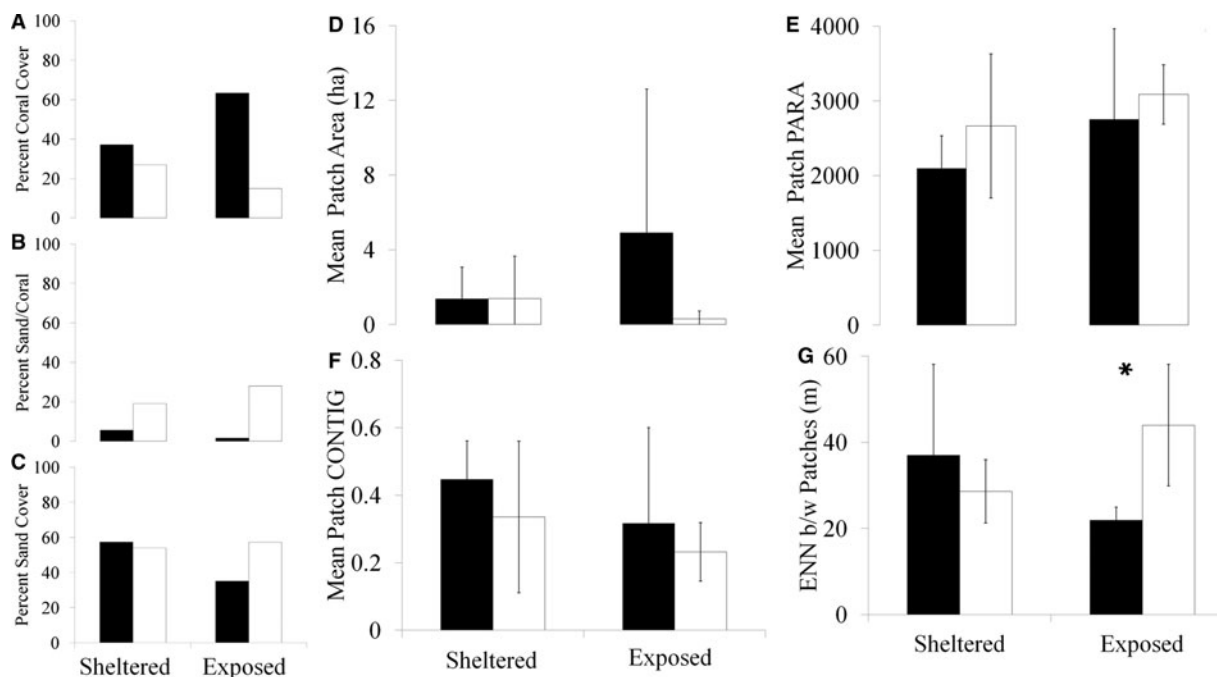


Fig. 7. Changes in per cent coral cover (A), sand/coral mixture (B) and sand (C) between the early 1980s (black) and 2008–2009 (white) on the sheltered and exposed portions of Klein Bonaire. Changes in the patch parameters area (D), PARA (E), contiguity index (F) and ENN distance (G) between the early 1980s (black) and 2008–2009 (white) on the exposed and sheltered sides of the island. Only the change in ENN distance over the time period on the exposed side of the island was significant ($U_{31,8} = 50.5$, $P = 0.01$). *Indicates a significant difference between time periods. Error bars indicate \pm two standard errors.

stretches of coral patches have been broken up along the coast over time, as in MRI, MR2 and nMR2 (Figure 6), and coral in the shallowest part of the reef, along the coast, has been lost.

It is not surprising that increases in the number of patches of coral were accompanied by overall declines in cover and decreases in the size of individual patches. Patches with small nearest neighbour distances are typically situated in landscapes containing more habitat than are patches with large nearest neighbour distances, so this measure of isolation is generally related to amount of total habitat in the landscape (Fahrig, 2003). Connectivity showed positive changes as the Euclidean nearest neighbour (ENN) value declined over time in the sheltered marine reserve and in the exposed non-reserve site, but the sheltered non-reserve site experienced an increase in this value, with a larger number of smaller coral patches spaced farther apart from one another. Fragmentation *per se* implies a larger number of smaller patches; however, as these changes, in addition to the change in contiguity and connectivity values, were not significant, this suggests that habitat fragmentation is less of an issue on Bonaire than habitat loss in general. Fahrig (2003) suggests that the term ‘fragmentation’ be limited to the breaking apart of habitat, independent of habitat loss; this can happen on a reef when a large coral patch breaks apart at the centre, but gains area along the outside edges, resulting in no net loss of total habitat; empirical evidence to date suggests that the loss of habitat has large negative effects on biodiversity. Recent studies have shown that a variety of impacts can result from habitat fragmentation; it is unknown whether such impacts are the result of fragmentation itself, the total loss of habitat during fragmentation, degradation of the habitat after the fragments are isolated or the effect of isolation itself (Caley *et al.*, 2001). Most studies of habitat fragmentation in the marine environment have been in seagrass habitats (Eggleston *et al.*, 1998; Hovel & Lipcius, 2001, 2002). Shrimp are more abundant in small patches of seagrasses because a large perimeter-to-area ratio (PARA) is important for feeding (Eggleston *et al.*, 1998) and a greater number of invertebrate taxa occur in larger patches of seagrass habitat (Bowden *et al.*,

2001). Other studies have reported reduced survival in fragmented habitats as a result of increased exposure to predators along the edges of habitat patches, i.e. a large PARA (Brittingham and Temple, 1983; Andr n & Angelstam, 1988). These effects of fragmentation probably vary greatly by species (Eggleston *et al.*, 1998), particularly between invertebrates and fishes. Although loss of coral habitat on Bonaire is undoubtedly occurring, and the remaining available habitat is being broken into smaller patches, it is not possible to separate the effects of loss from fragmentation. Fahrig (2003) suggests that the effects of fragmentation *per se* may be greater in tropical systems than in temperate systems, but this prediction remains to be tested. Caley *et al.* (2001) represents an experimental study on a coral reef at a fine spatial scale and found habitat degradation to have a much greater detrimental impact than fragmentation, and the effects of fragmentation in the absence of loss and degradation to be either neutral or positive, and provides a useful and complementary approach to experiments at macro-landscape scales such as the present study. Unfortunately, landscape-level analyses of coral cover are lacking and do not lend well to experimental manipulation, particularly given the current fragile state of coral reef ecosystems. Satellite remote sensing techniques are a non-invasive method for coarsely classifying coral reef habitats (Mishra *et al.*, 2006; Relles *et al.*, 2012) rapidly at the landscape scale to assess changes in coral cover following disturbances such as disease, storms, sedimentation and eutrophication. The present study shows that modern maps created by this method can be compared to ancillary data sets to assess trends in coral cover over significantly longer time scales. Increased ground-truthing of the satellite data would be useful for improving the accuracy of the classification system, specifically the relatively poor user accuracy for the coral class reported here (50%).

Landscape-level analyses such as this are useful for evaluating the success of marine policy and focusing future management decisions on areas of concern, as coral reef ecosystems continue to change faster than our current abilities to measure those changes. Based on our findings the island of Bonaire seems to

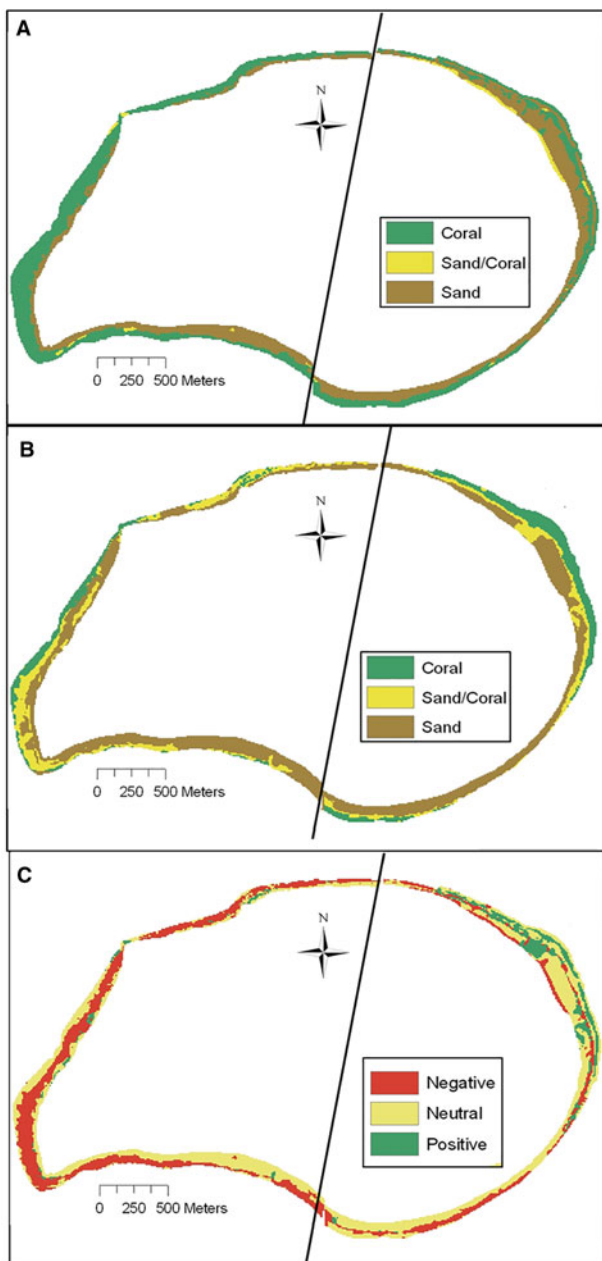


Fig. 8. Coral, sand/coral mixture, and sand classes on the western, exposed coast (left) and on the eastern, sheltered coast (right) of Klein Bonaire in the early 1980s (A) and 2008–2009 (B). The negative, neutral and positive change values over the time period along the exposed coast (C).

be doing better than elsewhere in the Caribbean as a well-managed and long-established Marine Protected Area (MPA). The work completed here can potentially be used to establish additional no-diving marine reserves by identifying areas that have maintained relatively high coral cover or have experienced increases in coral over the time period and also identify areas of concern that have not fared as well and may warrant an increased level of protection.

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References

- Andrén H and Angelstam P (1988) Elevated predation rates as an edge effect in habitat islands: experimental evidence. *Ecology* **69**, 544–547.
- Bak RPM, Nieuwland G and Meesters EH (2005) Coral reef crisis in deep and shallow reefs: 30 years of constancy and change in reef of Curaçao and Bonaire. *Coral Reefs* **24**, 475–479.
- Bellwood DR, Hughes TP, Folke C and Nystrom M (2004) Confronting the coral reef crisis. *Nature* **429**, 827–833.
- Bowden DA, Rowden AA and Martin J (2001) Effect of patch size and in-patch location on the infaunal macroinvertebrate assemblages of *Zostera marina* seagrass beds. *Journal of Experimental Marine Biology and Ecology* **259**, 133–154.
- Bries JM, Debrot AO and Meyer DL (2004) Damage to the leeward reefs of Curaçao and Bonaire, Netherlands Antilles from a rare storm event: Hurricane Lenny, November 1999. *Coral Reefs* **23**, 297–307.
- Brittingham MC and Temple SA (1983) Have cowbirds caused forest songbirds to decline. *BioScience* **33**, 31–35.
- Bruno JF, Sweatman H, Precht WF, Selig ER and Schutte VGW (2009) Assessing evidence of phase shifts from coral to macroalgal dominance on coral reefs. *Ecology* **90**, 1478–1484.
- Caley JM, Buckley KA and Jones GP (2001) Separating ecological effects of habitat fragmentation, degradation, and loss on coral commensals. *Ecological Society of America* **82**, 3435–3448.
- Cendrero A (1989) Mapping and evaluation of coastal areas for planning. *Ocean and Shoreline Management* **12**, 427–462.
- Eggleston DB, Etherington LL and Ellis WE (1998) Organism response to habitat patchiness: species and habitat-dependent recruitment of decapods crustacean. *Journal of Experimental Marine Biology and Ecology* **223**, 11–132.
- ESRI (Environmental Systems Resource Institute) (2010) *Arcmap 9.3*. Redlands, CA: ESRI.
- Fahrig LA (2003) Effects of habitat fragmentation on biodiversity. *Annual Review of Ecology, Evolution, and Systematics* **34**, 487–515.
- Gardner T, Cote IM, Gill JA, Grant A and Watkinson AR (2003) Long-term region-wide declines in Caribbean corals. *Science* **301**, 958–960.
- Gaston K and Blackburn T (2000) *Pattern and Process in Macroecology*. Oxford: Blackwell Scientific.
- Harte J, Conlisk E, Ostling A, Green JL and Smith AB (2005) A theory of spatial structure in ecological communities at multiple spatial scales. *Ecological Monographs* **75**, 179–197.
- He F and Legendre P (2002) Species diversity patterns derived from species-area models. *Ecology* **83**, 1185–1198.
- Hovel KA and Lipcius RN (2001) Habitat fragmentation in seagrass landscape: patch size and complexity control blue crab survival. *Ecology* **82**, 1814–1829.
- Hovel KA and Lipcius RN (2002) Effects of seagrass habitat fragmentation on juvenile blue crab survival and abundance. *Journal of Experimental Marine Biology and Ecology* **271**, 75–98.

- Jackson JBC, Donovan M, Cramer K and Lam V** (eds) (2014) *Status and Trends of Caribbean Coral Reefs 1970–2012*. Washington, DC: Global Coral Reef Monitoring Network, International Union for the Conservation of Nature Global Marine and Polar Program, 307 pp.
- Jackson JBC, Kirby MX, Berger WH, Bjorndal KA, Botsford LW, Bourque BJ, Bradbury RH, Cooke R, Erlandson J, Estes JA, Hughes TP, Kidwell S, Lange CB, Lenihan HS, Pandolfi JM, Peterson CH, Steneck RS, Tegner MJ and Warner RR** (2001) Historical overfishing and the recent collapse of coastal ecosystems. *Science* **293**, 629–638.
- Jensen JR** (2005) *Introductory Digital Image Processing: A Remote Sensing Perspective*. Upper Saddle River, NJ: Pearson Prentice Hall.
- Kjerfve B** (1981) Tides of the Caribbean Sea. *Journal of Geophysical Research* **86**, 4243–4247.
- Knowlton N, Lang JC, Rooney MC and Clifford P** (1981) Evidence for delayed mortality in hurricane-damaged Jamaican staghorn corals. *Nature* **294**, 251–252.
- Kohler KE and Gill SM** (2006) Coral Point Count with Excel® extensions (CPCe): a Visual Basic program for the determination of coral and substrate coverage using random point count methodology. *Computers and Geosciences* **32**, 1259–1269.
- Kramer PA** (2003) Synthesis of coral reef health indicators for the Western Atlantic: results of the AGRR program (1997–2000). *Atoll Research Bulletin* **496**, 1–57.
- Lyzenga DR** (1978) Passive remote sensing techniques for mapping water depth and bottom features. *Applied Optics* **17**, 379–383.
- Lyzenga DR** (1981) Remote sensing of bottom reflectance and water attenuation parameters in shallow water using aircraft and Landsat data. *International Journal of Remote Sensing* **2**, 71–82.
- McGarigal K, Cushman SA, Neel MC and Ene E** (2002) FRAGSTATS: Spatial pattern analysis program for categorical maps. Computer software program produced by the authors at the University of Massachusetts, Amherst. Available at: <http://www.umass.edu/landeco/research/fragstats/fragstats.html>.
- Mishra DR, Narumalani S, Rundquist D and Lawson M** (2006) Benthic habitat mapping in tropical marine environments using QuickBird multispectral data. *Photogrammetric Engineering and Remote Sensing* **72**, 1037–1048.
- Mumby PJ, Clark CD, Green EP and Edwards AJ** (1998) Benefits of water column correction and contextual editing for mapping coral reefs. *International Journal of Remote Sensing* **19**, 203–210.
- Mumby PJ, Green EP, Edwards AJ and Clark CD** (1997) Coral reef habitat mapping: how much detail can remote sensing provide? *Marine Biology* **130**, 193–202.
- Opdam P and Wascher D** (2004) Climate change meets habitat fragmentation: linking landscape and biogeographical scale levels in research and conservation. *Biological Conservation* **117**, 285–297.
- Pandolfi JM and Jackson JBC** (2001) Community structure of Pleistocene coral reefs of Curaçao, Netherlands Antilles. *Ecological Monographs* **71**, 49–67.
- Relles NJ, Jones DOB and Mishra DS** (2012) Creating landscape-scale maps of coral reef cover for marine reserve management from high resolution multispectral remote sensing. *GISciences and Remote Sensing* **49**, 251–274.
- Saunders DA, Hobbs RJ and Margules CR** (1991) Biological consequences of ecosystem fragmentation: a review. *Conservation Biology* **5**, 18–32.
- Schroeder RE** (1987) Effects of patch reef size and isolation on coral reef fish recruitment. *Bulletin of Marine Science* **42**, 441–451.
- Steneck RS, Arnold S and DeBey H** (2011) Status and Trends of Bonaire's Coral Reefs 2011 & Causes for Grave Concern. Report to STINAPA Bonaire. Available at: <http://stinapabonaire.org/nature/coral-reefs-adjacent-waters/>.
- Steneck RS, Arnold SN, de León R and Rasher DB** (2015) *Status and Trends of Bonaire's Coral Reefs in 2015: Slow but Steady Signs of Resilience*. Report to STINAPA Bonaire. Available at: <http://www.dcbd.nl/sites/www.dcbd.nl/files/documents/Steneck.%20Status%20of%20Bonaire%27s%20Coral%20Reefs%202015.pdf>.
- Stokes MD, Leichter JJ and Genovese SJ** (2010) Long-term declines in coral cover at Bonaire, Netherlands Antilles. *Atoll Research Bulletin* **582**, 23 pp.
- Turner MG, Gardner RH and O'Neill RV** (2003) *Landscape Ecology in Theory and Practice: Pattern and Process*. New York, NY: Springer-Verlag.
- van den Berg LJJ, Bullock JM, Clarke RT, Langston RHW and Rose RJ** (2001) Territory selection by the Dartford warbler (*Sylvia undata*) in Dorset, England: the role of vegetation type, habitat fragmentation and population size. *Biological Conservation* **101**, 217–228.
- van Duyl FC** (1985) *Atlas of the Living Reefs of Bonaire and Curaçao (Netherlands Antilles)*. Amsterdam: Vrije Universiteit.