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Climate change effects on the marine characteristics of the Aegean and Ionian Seas

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Abstract This paper addresses the effects of estimated climate change on the sea-surface dynamics of the Aegean and Ionian Seas (AIS). The main aim is the identification of climate change impacts on the severity and frequency of extreme storm surges and waves in areas of the AIS prone to flooding. An attempt is made to define design levels for future research on coastal protection in Greece. Extreme value analysis is implemented through a nonstationary generalized extreme value distribution function, incorporating time harmonics in its parameters, by means of statistically defined criteria. A 50-year time span analysis is adopted and changes of means and extremes are determined. A Regional Climate Model (RegCM3) is implemented

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with dynamical downscaling, forced by ECHAM5 fields under 20C3M historical data for the twentieth century and the SRES-A1B scenario for the twenty-first century. Storm surge and wave models (GreCSSM and SWAN, respectively) are used for marine climate simulations. Comparisons of model results with reanalysis and field data of atmospheric and hydrodynamic characteristics, respectively, are in good agreement. Our findings indicate that the dynamically downscaled RegCM3 simulation adequately reproduces the present general circulation patterns over the Mediterranean and Greece. Future changes in sea level pressure and mean wind fields are estimated to be small, yet significant for marine extremes. In general, we estimate a projected intensification of severe wave and storm surge events during the first half of the twenty-first century and a subsequent storminess attenuation leading to the resettlement of milder extreme marine events with increased prediction uncertainty in the second half of the twenty-first century.

Keywords Aegean and Ionian Seas . Climate change . Storm surges . Waves . Extreme value analysis . SRES-A1B

Abbreviations

1 Introduction

Climate change is expected to affect the frequency, trajectory and intensity of storms (IPCC [2007](#page-33-0), [2012\)](#page-33-0) in many areas around the world. This projection has led to estimations of local increase of extreme water levels in the future, especially if the combined effect of rising sea level and high storm surges is taken into account (Wang et al. [2008\)](#page-34-0). Furthermore, climate change may affect hydrodynamic conditions in nearshore areas driving consequent changes in the wave climate that may increase the vulnerability of coastal zones and their defences.

Several researchers have studied the effects of climate change on the wind, wave and storm surge characteristics around the world. Specific evidence of climate change impacts on atmospheric circulation patterns over Europe and the marine hydrodynamics of the European seas have been provided in a number of studies. Esteves et al. ([2011](#page-33-0)) investigated the general metocean trends at the eastern Irish Sea. Grabemann and Weisse [\(2008](#page-33-0)) analysed present mean and extreme wave conditions in the North Sea and their possible future changes due to anthropogenic climate change. Van den Eynde et al. ([2012](#page-34-0)) investigated the evolution of extreme winds, wave heights and storm surge levels in the Belgian part of the North Sea to assess the changes in the marine storminess. De Winter et al. [\(2012](#page-33-0)) studied the changes of the mean wave climate and the annual maxima of wave heights with return periods of up to $10⁴$ years

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in front of the Dutch coast under the SRES-A1B scenario. The basic features of the wave climate and its changes in the southwestern Baltic Sea were presented by Soomere et al. ([2012\)](#page-34-0). An assessment of overall climate change impacts on the Baltic Sea was reported by The BACC Author Team ([2008\)](#page-34-0).

Several studies focus either on the entire basin or on parts of the Mediterranean Sea, such as the eastern Spanish coastal zone, the Adriatic, the Aegean, the Ionian, the Levantine and the Libyan Seas. Lionello et al. [\(2008\)](#page-33-0) studied the Mediterranean wave climate, based on 30-year-long (2071–2100) simulations of the wind-wave fields with the WAve prediction Model (WAM) under the SRES-A2 and B2 scenarios. They also simulated the wind-wave fields for a near-past reference period of equal duration (1961–1990), in order to represent the present climate. Results showed that changes of significant wave height (SWH), wind speed and atmospheric circulation were consistent and that marine storms will probably be milder in the future than in the present climate. Benetazzo et al. [\(2012](#page-32-0)) analysed the wave climate of the Adriatic Sea, under the SRES-A1B scenario for the 2070–2099 period, and also concluded that a milder future wave climate is expected, even though wave severity may intensify locally. Future regional climate projections at a rather high spatiotemporal resolution for the projected wave fields of the northwestern Mediterranean Sea were obtained by Casas-Prat and Sierra ([2013\)](#page-33-0). Relative changes of SWH reached up to ± 10 % for the mean climate and up to ± 20 % for extremes. Androulidakis et al. [\(2015\)](#page-32-0) estimated a decreasing trend in storminess under the SRES-A1B scenario, mostly related to the frequency, duration and spatial coverage of local storm surge maxima and in the Mediterranean. Relevant climate change studies on sea-surface dynamics specifically targeted on the east-central Mediterranean Sea and particularly on the Aegean and Ionian Seas (AIS) have not been previously reported. Hence, in order to address the aforementioned information gap, the main aims of the present paper are the following:

- (i) To estimate the future climate over the AIS, with a special focus on the simulation of wind and sea level pressure (SLP) fields for the twenty-first century
- (ii) To assess the effects of climate change on the sea-surface dynamics of the AIS, i.e. estimate changes in waves and storm surges up to 2100
- (iii) To quantify the severity and frequency of extreme wave and storm surge events in the AIS in order to produce design levels for coastal protection works in Greece (next step of the research project referenced in the Acknowledgments)
- (iv) To identify specific mechanisms of regional climate change in the AIS, i.e. estimate the projected overall attenuation or amplification of storminess in the AIS towards the end of the twenty-first century

Therefore, an attempt is made to investigate the effects of potential climate change on the atmospheric features (wind and pressure fields), the wave characteristics and the storm surges in the AIS. The Regional Climate Model (RCM), RegCM3 (Giorgi et al. [1993a,](#page-33-0) [1993b\)](#page-33-0), is used; it is forced by the Global Climate Model (GCM) of the Max Planck Institute for Meteorology ECHAM5 (Roeckner et al. [2003\)](#page-34-0) simulated fields, produced under 20C3M historical scenario for the twentieth century and the SRES-A1B scenario for the twenty-first century.

The specific goals of our analysis are designated as follows. The simulated wind and SLP fields (temperature and precipitation are not presented herein) are compared and evaluated against available reanalysis data (Section [3.1](#page-10-0)) for the time span 1981– 2000. New data archives for wind and SLP fields are produced for the entire Mediterranean basin covering the period up to 2100 (Tolika et al. [2015\)](#page-34-0). The RegCM3 climate simulations are implemented with a downscaled spatial resolution in the AIS domain, one-way nested to the coarser Mediterranean domain. We attempt to evaluate the dynamically downscaled atmospheric fields against reanalysis data for the twentieth century.

The Simulating WAves Nearshore (SWAN) model (Booij et al. [1999](#page-33-0), Ris et al. [1999](#page-34-0)) is used for the simulations of the past, current and future wave climate. A two-dimensional barotropic model of hydrodynamic ocean circulation (Greek Climatic Storm Surge Model; GreCSSM) is used to simulate the past, current and future storm surge climate. GreCSSM is based on the numerical model simulating the storm-induced sea-surface variations, which was developed by De Vries et al. ([1995](#page-33-0)), validated and implemented by Krestenitis et al. [\(2011\)](#page-33-0). GreCSSM is one-way nested to the coarser implementation of the same model for the entire Mediterranean region (Mediterranean Climatic Storm Surge Model; MeCSSM), presented by Androulidakis et al. [\(2015\)](#page-32-0). Both the wave and storm surge models were calibrated with available model, satellite and field data (Sections [3.2](#page-12-0) and [3.3\)](#page-13-0).

To assess the climate change effects on the wave and storm surge characteristics of the AIS, the changes of 50-year patterns for the mean and extreme waves and storm surges are determined until the end of the twenty-first century. We adopted a 50-year time span analysis (1951–2000, 2001– 2050 and 2051–2100) to increase the reliability of extreme value analysis of marine characteristics.

To quantify climate change effects on the severity and frequency of extreme marine events, extreme value analysis of waves and storm surges is applied. Comparisons of certain hydrodynamic characteristics are presented for the three 50-year periods indicating estimated changes between the past, current and future extreme marine climate of the AIS. Moreover, we estimate the prediction uncertainty, future trends and return levels of the simulated hydrodynamic features, i.e. characteristics of wave heights and storm surges. The results can be used to estimate coastal vulnerability indexes and to produce design levels for future coastal protection works in the AIS. The mean sea level (MSL) and sea level rise (SLR) projections in the Mediterranean and the AIS are also concisely reviewed based on available state-of-the-art data in the relevant literature.

Subsequently, the study area and its main atmospheric (winds, pressures and storms) patterns and marine (MSL, waves and storm surges) characteristics are presented in Section 2. The implemented models are presented in Section [3](#page-9-0), emphasizing on their main characteristics, spatiotemporal resolutions and validation attributes. In Section [4,](#page-16-0) the past, current and future patterns of winds, SLP, waves and storm surges are analysed for mean and extreme values, and the climate change signals are identified, followed by discussion and comparisons against existing literature. The main conclusions are presented in Section [5](#page-31-0).

2 Study area

The study area (Figs. 1b and [2](#page-6-0)b) is located in the east-central part of the Mediterranean Sea, between longitudes 19.4° E and 30° E and latitudes 30° N and 42° N. It mostly concerns the aquatic

bodies that abut the Greek mainland and the western coasts of Anatolia (Turkey), comprising the AIS (Fig. [2](#page-6-0)b, c: Ionian, North and South Aegean Seas). The overall simulation domain also covers part of the south-central Mediterranean, the Libyan Sea and a small westernmost part of the Levantine Sea (Fig. [2](#page-6-0)c). The complicated continental orography and the presence of a very large number of islands, mostly in the Aegean archipelago, render the study area very interesting from a climate modelling viewpoint. Furthermore, the respective water bodies have a rapidly varying bathymetry with deep basins and extensive, rather shallow, continental shelves and extremely complex coastlines. The latter are divided almost equally into steep reflective rocky formations, frequently interrupted by mostly short (and rarely wide) dissipative beaches ideal for touristic activities. Moreover, both Greek and Turkish coastal zones are highly populated with numerous coastal cities, ports, harbours and marinas, river deltas, protected wetlands, islets, insular formations, highly irregular coastlines and lowland elevation coastal areas. These

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Fig. 2 Marine maps of the study area: a level I bathymetry (m) for marine simulations (1/5° to 1/10° resolution); b level II bathymetry (m) for marine simulations $(1/20^{\circ}$ resolution); c 6 subregions of interest (N. and S. Aegean, Ionian, SC Med, Libyan and Levantine) denoted by

different colours, 8 marine areas (Kerkira, Parga, Kyparissia, Chania, Heraklion, Lesvos, Katerini, Alexandroupoli) where extreme value analysis is conducted denoted by green hatches, 13 coastal gauges denoted by red dots and 3 offshore stations denoted by blue stars

low coastal plains are at high inundation risk in cases of extreme storm surge events, especially when combined with high waveinduced set-up in the surf zone and run-up on beaches and waterfronts. The particular coastal topography of certain marine areas (Fig. 2c) makes them potentially prone to coastal flooding even for moderate sea level elevations due to storm surges. Overall, the topographic complexity of the entire Greek and the western Turkish coastlines plays an important part in the configuration of the wind regime, the wave field and the storm-induced sea level variations.

2.1 Atmospheric circulation and wind patterns

The atmospheric circulation over the Mediterranean basin is strongly affected by the main atmospheric centres of action: the permanent ones, i.e. the Azores high and the Icelandic low over the North Atlantic Ocean and the seasonal semi-permanent ones, i.e. the winter Siberian high-pressure system, the summer Asian thermal low, the West African heat low and the high-pressure systems of Europe and Balkan Peninsula (Barry and Carleton [2001](#page-32-0)). Cold air masses are observed in Asia and Eastern

Europe due to the Siberian high, which is replaced by a centre of low pressure during the warm period (viz. spring and summer seasons), developed above South Asia and Middle East (known as Asian thermal low). This low-pressure system and the Balkan Peninsula high pressure are the two centres of action that result in the Etesian winds over the Aegean Sea during the warm period (Anagnostopoulou et al. [2014](#page-32-0)).

However, the Mediterranean basin is also a major source of origination or reinforcement of cyclones (Gil et al. [2002](#page-33-0)). In its western part, there are three main regions of cyclogenesis (Trigo et al. [1999](#page-34-0)): (a) the Genoa centre; (b) the Saharan cyclones, dominant during spring; and (c) the Iberian peninsula thermal lows with three discrete centres (viz. eastern, western and central), forming from late spring through the summer, particularly pronounced between June and August. In the eastcentral and eastern Mediterranean, four regions of cyclogenesis are distinguished (Trigo et al. [1999,](#page-34-0) Maheras et al. [2001\)](#page-33-0): (a) the Aegean Sea, one of the major cyclogenesis regions during winter and spring; (b) the eastern Black Sea, which contains an all-year major centre that is more pronounced during July and August; (c) the vicinity of Cyprus, which is also a year-round cyclone source; and (d) the Middle East with main centres over Syria and Iraq. The latter are the main regions of summer cyclogenesis in the eastern Mediterranean due to the extension of the Indian monsoon low.

The prevailing atmospheric circulation patterns in the AIS are mainly characterized by northerly winds. Specifically during the cold period (viz. autumn and winter seasons), northeasterly winds prevail in the northern Aegean Sea and northerly winds in its central and southern parts. Winds are mainly of a western component in the Ionian Sea. The strongest winds, related to regions of large wave heights in the Aegean Sea, are mainly observed in its northern and central offshore parts, as well as in the southwestern Aegean boundary, i.e. the straits between Peloponnesus and Crete (Vagenas et al. [2014](#page-34-0)). During the warm period, the Aegean Sea is predominated by the Etesians (or Meltemia), which constitute one of the most persistent localized wind systems in the world (Anagnostopoulou et al. [2014](#page-32-0)). The Etesians are dominant mainly during summer and early autumn over the Aegean Sea and parts of the eastern Mediterranean; Etesians are northeasterlies in the northern Aegean Sea, turn to northerlies in the central and southern Aegean Sea and to northwesterlies near the southwestern coasts of Turkey (Savvidis et al. [2004\)](#page-34-0).

2.2 Wave characteristics

The wave climate of the AIS is strongly affected by physical mechanisms taking place in the Mediterranean Sea. Due to

very limited flow exchange with the Atlantic Ocean through the Strait of Gibraltar, the Mediterranean is an effectively closed basin regarding wave phenomena. Thus, the dominant wave patterns are mainly dependent on the wind conditions, the varying Mediterranean bathymetry and the interaction with complex coastlines and numerous islands. The Mediterranean basin can be practically viewed as comprising two distinct parts connected via the Strait of Sicily.

Focusing on the main study area of the AIS, the Ionian is a marginal sea with a semi-open basin containing a relatively small number of islands in proximity to the mainland. Winter mean values of the SWH, H_s , for recent decades vary from 1.2 to about 1.7 m from the northern to the southern Ionian Sea (Athanassoulis and Skarsoulis [1992,](#page-32-0) Athanassoulis et al. [2004,](#page-32-0) Soukissian et al. [2008](#page-34-0)). The most frequent mean wave directions are from the west-southwest sector due to Libeccio wind and from the southeast sector due to Sirocco (Zecchetto and De Biasio [2007](#page-34-0)). The Bora winds from the northeast sector (Dykes et al. [2009](#page-33-0)) have no significant effect on the wave field due to the strong sheltering offered by the mainland, especially the Pindus mountain range. A more diverse wave regime is found in the Aegean Sea due to its complex bottom topography, the presence of channels combined with fetch regions of moderate extent and the numerous islands. Being cut out from the rest of the Mediterranean by the island of Crete and other islands of the outer Hellenic Arc, the Aegean Sea exhibits lower H_s values. Winter mean values for recent decades span from about 0.6 to 1.3 m with maxima located at the northeastern Aegean, the central Aegean (north of Cyclades island group), the Crete-Kythira and Crete-Karpathos straits (Athanassoulis et al. [2004](#page-32-0), Soukissian et al. [2008\)](#page-34-0). The directionality of waves in the Aegean during summer is dominantly of the north sector due to the Etesians, which diminish during the winter when violent cyclonic storms occur (Soukissian [2005\)](#page-34-0). These winter storms produce almost exclusively north and south sector seas, while western and eastern events appear with much lower frequency (Christopoulos [1997\)](#page-33-0).

2.3 Storm surge characteristics

The storm surges in the AIS are mainly induced by the inverse barometer effect and only locally by strong winds, caused by usually enfeebled extra-tropical storms that follow a west-toeast path over the Mediterranean Sea (Krestenitis et al. [2011\)](#page-33-0). Sea level extremes are mainly related to storm surges rather than to the combination of tides and surges in the study area (Marcos et al. [2009](#page-34-0)).

Tsimplis and Vlahakis ([1994\)](#page-34-0) investigated the effect of atmospheric pressure and surface winds on the sea level variability of the Aegean Sea. They found a very high spatial correlation between sea level height (SLH) and SLP, as well as meridional (North-to-South) wind components, explaining

90 % of total SLH variations throughout the central and eastern parts of the study area. Tsimplis and Blackman [\(1997\)](#page-34-0) analysed extreme sea levels from 18 ports in the AIS using SLH recordings from 1982 to 1989. They found higher 50-year return levels (by 0.2 to 0.3 m) in stations located in the North Aegean than those of the central and southern AIS, in which the predicted return levels were of similar magnitudes. They calculated 50-year return levels that ranged between 0.35 and 0.37 m in the South and Central Aegean (Chania, Peiraeus, Chios and Syros) and between 0.64 and 0.70 m in the North Aegean (Thessaloniki and Alexandroupoli). By assuming higher return levels (100 to 500 years) the related increase in SLH was low (of the order of 5 cm).

Marcos et al. ([2011](#page-34-0)) extensively studied the changes in storm surge characteristics over the Mediterranean Sea using different climate projections. Their results showed that an average of 4 to 5 moderate surge events $(>0.15$ m) per year occurred in the AIS in the past, with the highest frequencies in the North Aegean. However, they found that these frequencies are expected to decrease by 1 to 2 events per year under the SRES-A1B scenario towards the end of the twenty-first century. The related changes of 50-year return levels of positive surges during 2090–2099 with respect to the ones of 1990–1999 were of the order of −3 to −4 cm in the AIS, apart from the Sea of Crete (south-most part of the South Aegean) and the Libyan Sea, where the reduction was lower (−2 cm). Similarly, Jordà et al. ([2012](#page-33-0)) estimated decreasing trends of -0.18 ± 0.04 mm/year for *SLH* in the eastern Mediterranean under SRES-A1B scenario. They estimated an increase of the storm surge seasonal cycle, i.e. a decrease of winter-autumn occurrence frequencies accompanied by an increase of springsummer ones.

Conte and Lionello ([2013](#page-33-0)) examined surges in the Mediterranean Sea under SRES-A1B scenario using various climatic datasets for the 1951–2050 period. Their results showed \pm 5 % future changes for positive surges in the area, whereas a weighted ensemble mean of all climate simulations showed a robust and widespread reduction of surge magnitudes. They also found that the contribution of SLP and wind on positive surges in the AIS is of the order of 55–75 % and 25–45 %, respectively. This was corroborated by Androulidakis et al. ([2015](#page-32-0)), who found similar behaviour with slightly higher contribution of SLP (65–75 %) to storm surge maxima in the AIS.

2.4 Mean sea level

Projections of sea level changes due to short time-scale processes, such as waves and storm surges, should be superimposed to projections of long-term *MSL*, mainly depending on changes in the hydrographic characteristics (i.e. volume changes) and the net water mass addition due to ice melting. Although in a few previous studies the MSL

variability in the Mediterranean during the twenty-first century was investigated, most of them include only on the steric or thermosteric effect.

Marcos and Tsimplis [\(2008\)](#page-34-0) first pointed out the complexity of the problem using various GCM projections under three scenarios (i.e. committed climate change, SRES-A1B and A2). They showed lack of agreement on sea level trends between the models, due to coarse resolution and inadequate connection with the Atlantic, and therefore stressed the need for high-resolution RCM projections. Tsimplis et al. [\(2008](#page-34-0)) analysed the results of a high resolution, air-sea coupled climate model under the SRES-A2 scenario, projecting a Mediterranean maximum steric SLR of 25 cm for the end of the twenty-first century. For the AIS region, the steric SLR was even smaller, viz. less than 15 cm in the Ionian and less than 5 cm in the Aegean Seas. The calculated differences relied on analysis of 30-year time intervals, namely between 2070 and 2099 and 1961–1990, yet implied that a globally pessimistic scenario may not result in high sea levels for the AIS.

Carillo et al. ([2012](#page-33-0)) examined the role of steric effect on the future MSL change extending their analysis until 2050. They projected a thermosteric SLR of about 5 cm for the AIS by 2050 (vs. 1951–2000) under the SRES-A1B scenario, which could become slightly higher (12 cm for the Ionian and 7 cm for the Aegean) under different boundary conditions connecting the Mediterranean with the Atlantic. More recently, Adloff et al. [\(2015](#page-32-0)) investigated the response of the Mediterranean to six different climate change scenarios (SRES-A1B, B1 and A2 under different forcings), and found larger basin-averaged thermosteric SLR of about 10 cm and 30–40 cm for the 2000– 2050 and 2050–2099 periods, respectively. To assess total SLR, other components should be included (e.g. mass addition due to land ice melting), adding between 15 and 30 cm to the thermosteric component, according to the IPCC AR5 (IPCC [2013\)](#page-33-0). This value agrees well with recent estimates of MSL trend due to changes in the mass (GRACE program), corresponding to about 2.5 mm/year, averaged over the whole Mediterranean for the period from January 2003 to July 2013 (Tsimplis et al. [2013](#page-34-0)). If this trend remains constant, the mass addition should raise the Mediterranean MSL by approximately 12 cm by 2050 and 25 cm by 2100. Both Carillo et al. [\(2012\)](#page-33-0) and Adloff et al. [\(2015](#page-32-0)) draw attention to the large uncertainty introduced by the hydrographic characteristics of the Atlantic prescribed as boundary conditions to the Mediterranean model; Adloff et al. [\(2015\)](#page-32-0) conclude that the choice of the near-Atlantic surface water evolution has the largest impact on the thermosteric sea level ranges, larger than the choice of the socio-economic scenario. This conclusion should also apply to a more regional scale, regarding the role of the Black Sea hydrographic characteristics to the evolution of the Aegean MSL, as it is an area susceptible to buoyancy changes imported from the Dardanelles (Zervakis et al. [2000\)](#page-34-0). The only regional multimodel assessment of future sea level change of the whole Mediterranean basin has been carried out in the

framework of the CIRCE project (Gualdi et al. [2013](#page-33-0)), showing a positive steric trend of 0.29 ± 0.13 cm/year, or a total steric rise between 7 and 12 cm for the 2021–2050 period (vs. 1961–1990) under the SRES-A1B scenario.

In general, compared to the significant scientific progress at global scale, the advances at the Mediterranean scale remain small in terms of MSL assessment from regional ocean models (Slangen et al. [2016](#page-34-0)), especially due to uncertainties regarding exchanges with neighbouring seas.

3 Methods and models for the analysis of the marine climate

The numerical models, used for the climate simulations of the weather conditions and the marine characteristics of the AIS,

are presented together with the statistical methods for correcting bias and deriving extreme values. The main attributes of an RCM, a wave and a storm surge model are briefly described (Table 1) together with validation results for assessing their performance.

A 50-year time span analysis is adopted, in order to meet two basic requirements: (a) the annual maxima within each period should be considered adequately stationary and (b) the dataset of each period should be large enough to provide a good fit of the marginal extreme value distributions. The simulations cover the 150-year period 1950–2100 (Table 1). Results are derived for a reference period (1951–2000), a current period (2001– 2050; representative of the present and near future climate) and a future period (2051–2100). For the reference period the RCM is forced by GCM fields which are

Table 1 Basic parameterizations, major attributes and simulation scheme properties of the climate (RegCM3), wave (SWAN) and storm surge (MeCSSM/ GreCSSM) models. Differences between the coarse (level I) and downscaled (level II) implementations for all the models

produced under the historical 20C3M scenario that incorporates an increase of greenhouse gasses as observed through the twentieth century (IPCC [2001](#page-33-0)). For the twenty-first century projections, the RCM is forced by GCM fields simulated under the SRES-A1B emission scenario. The latter is based on the assessment that all the energy sources will be equally used, and is characterized as an intermediate scenario with the $CO₂$ concentrations reaching up to 700 ppm until the end of twenty-first century (IPCC [2001](#page-33-0)). SRES-A1B belongs to scenarios that describe a future world of very rapid economic growth with prompt introduction of new and more efficient technologies and fast increase of global population that peaks in the midst of the twenty-first century, but declines thereafter.

Two simulation levels are used for all models: level I includes the entire Mediterranean Sea with a model-dependent spatial resolution (Figs. [1a](#page-5-0) and [2a](#page-6-0)) and level II covers an eastcentral Mediterranean subsection including the AIS (Figs. [1](#page-5-0)b and [2b](#page-6-0)). The computational domains of Fig. [1](#page-5-0) refer to the atmospheric simulations and of Fig. [2](#page-6-0) to the hydrodynamic simulations. In addition, level II is divided into discrete subregions (e.g. South/North Aegean, Ionian, etc. denoted by different colours in Fig. [2](#page-6-0)c) and the extreme value analysis focuses on eight nearshore areas of interest (denoted by green hatches in Fig. [2](#page-6-0)c) due to potentially high vulnerability to flooding.

3.1 The Regional Climate Model

RegCM3 (Giorgi et al. [1993a,](#page-33-0) [1993b](#page-33-0)) is used in its modified and improved form (Giorgi and Mearns [1999](#page-33-0), Pal et al. [2007](#page-34-0)) to incorporate the complex terrains and sharp orography of the study domains. The dynamical component of RegCM3 is a compressible, finite difference model with hydrostatic balance and vertical σ -coordinates using a split-explicit time-integration scheme along with an algorithm for reducing horizontal diffusion in the presence of steep topographical gradients. Two different implementations were performed, namely RegCM3-25Km (level I) and RegCM3-10Km (level II), with the finer one nested into the coarser one. The basic parameterizations (spatial resolutions, convective precipitation schemes and closure assumptions) for both simulations are shown in Table [1](#page-9-0).

The dynamically downscaled simulation with RegCM3 at higher resolution has been proven to provide better results of climatic parameters than the one performed at lower resolution over Greece and the AIS (Tolika et al. [2015\)](#page-34-0). Moreover, a new evaluation of results is presented concerning modelled fields of both wind (Fig. 3) and mean SLP (Fig. [4\)](#page-11-0) in comparison to the ERA-Interim data (Berrisford et al. [2011,](#page-32-0) Dee et al. [2011](#page-33-0)). The latter are available from January 1979 up to present time, derived from the IFS 2006 edition (Cy31r2). They include fourdimensional variational analysis at a spatial resolution of 80 km

Fig. 3 Evaluation of RegCM3 model results (winds) for three locations (i) Alexandroupoli, (ii) Kerkyra and (iii) Chania over the domain of study for a January (left-panel graphs) and **b** July (right-panel graphs) in comparison with the ERA-Interim data for the period 1981–2000. Graphs of the first and third columns $(aI \text{ and } bI)$ are box-plots of wind

speeds (m/s), and graphs of the second and fourth columns $(a2 \text{ and } b2)$ are occurrence frequency (%) distribution diagrams. Text boxes of the box plots $(a1 \text{ and } b1)$ refer to the average and standard deviation values of modelled and ERA-Interim wind speeds (m/s); text boxes of the distribution graphs $(a2 \text{ and } b2)$ refer to the respective HRP index

Fig. 4 (i) Monthly SLP (hPa) spatial distribution from ERA-Interim and RegCM3 for a January and b July (upper row of graphs). (ii) Spatial distribution maps of mean SLP differences (%) between ERA-Interim and RegCM3 fields and box plots of the mean SLP differences (mid row of graphs). (iii) Spatial distribution maps of the HRP index for a

January and **b** July (lower row of graphs); the regions that are not coloured are the ones where HRP index has values greater than the limit of 0.95, which indicates no imperative need for bias correction in climate data for the purposes of the present paper

and 60 vertical levels from surface up to 0.1 hPa. The relevant fields were downscaled to a finer spatial resolution of $0.125^{\circ} \times 0.125^{\circ}$ (i.e. spatial discretization step around 12.5 km in the AIS), in order to closely resemble the RegCM3-10Km resolution. In the present study, we used both wind and SLP data for the period 1981–2000. Specifically, three characteristic regions were selected for the validation of the wind fields: (a) Alexandroupoli in northern Greece; (b) Kerkira in the island of Corfu (northern Ionian Sea); and (c) Chania in the island of Crete (southern Aegean Sea). Representative grid points were selected for these areas, sc. one from the RegCM3-10Km simulation archive and the nearest one from the ERA-Interim data archive; these were closer to each other than available meteorological stations in the area. Statistical measures were calculated to define the simulation skill of the model used.

Figure [3](#page-10-0) illustrates the RegCM3 validation results for the 1981–2000 time span for a winter and a summer month, i.e. (a) January and (b) July. As a first step, box plots (Fig. [3a](#page-10-0)1, b1) showing the range of the wind speed values, as well as the 25 and 75 % quantiles, and the median are presented. RegCM3- 10Km shows a satisfactory skill in representing the median of the wind speeds. Especially in Chania (Fig. [3i](#page-10-0)ii), the model also captures the whole range of the values found for the examined period. RegCM3-10Km was able to simulate the outer edges of the boxes (25 and 75 % quantiles), even though this range is quite smaller than the ERA-Interim one in some of the cases. Furthermore, it was found that RegCM3-10Km simulations can also reproduce the mean value of the wind speed; generally, the differences are less than 1 m/s and thus insignificant for our analysis. The standard deviations of the wind speed time series are very similar to the ones of the ERA-Interim datasets (Fig. [3](#page-10-0)a1, b1). The occurrence frequency (%) of wind speeds was also calculated and is presented in Fig. [3](#page-10-0)a2, b2. Overall, the model manages to detect the ERA-Interim distributions and captures both the low and high classes, as well as the most frequent one (peak of the probability distribution function). The only exceptions correspond to Alexandroupoli and Kerkira in July (Fig. [3](#page-10-0)b2i, b2ii), where the model results underestimate the high frequency class. Nevertheless, most of the wind speed values (e.g. classes from 2 to 8 m/s) show a similar frequency of occurrence, especially in Alexandroupoli and Chania (Fig. [3a](#page-10-0)2i, a2iii).

The bias of wind fields between model and Era-Interim datasets could be attributed either to a low-skill representation of the dynamical and synoptic factors of atmospheric circulation or to the weakness of the model in capturing the complex terrain of the study domain. The plausibility of vertical (baroclinic) distributions of wind characteristics is strongly influenced by the preciseness of the orography representation. In our case, the simulation of SLP and pressure gradients by RegCM3-10Km is satisfactory as shown in the next paragraphs. Thus, one of the main reasons for biases in wind results is probably the accuracy of the model's topography scheme of the area.

Aiming to quantitatively assess the ability of the dynamically downscaled model to reproduce wind fields and decide on the essentiality of bias correction, we also calculated and used a model evaluation measure, i.e. the hit rate of percentiles (HRP) index (Schoetter et al. [2012\)](#page-34-0). Namely, one computes the absolute differences between sorted (from 1st to 99th) percentiles of simulated and observed values. Then the HRP index is defined as the sum of the categorical fractions, i.e. differences compared to an allowed deviation. Schoetter et al. [\(2012\)](#page-34-0) determined the values of allowed deviation for wind speed as 1 m/s. If HRP index (with range between 0 and 1) is greater than 0.95, then the model efficiently represents the regarded observation time series and the simulated dataset under examination does not need to be corrected for bias. HRP is independent of the variable under evaluation; thus, it is also used for the assessment of gridded SLP fields.

Therefore, we computed the HRP index (its total and its values for three percentile classes; 1st–33rd, 34th–66th and 67th–99th percentiles), in order to evaluate the RegCM3- 10Km skill for the simulation of the entire wind speed time series and the low, medium and high ranges of wind speeds for the three selected areas. It was found that the model simulates wind speeds adequately, since HRP exceeds the limit of 0.95 and reaches the value of 1 both in total and in the three separate classes, especially in the case of Chania (Fig. [3a](#page-10-0)2iii, b2iii). The only exception is the case of Alexandroupoli during July where *HRP* is quite lower (0.76; Fig. [3b](#page-10-0)2i). However, this is due to inadequate representation of only the first class (lowspeed winds), which is not important for the analysis of extreme waves and storm surges.

Regarding the mean SLP evaluation, the spatial distribution of monthly mean values for January and July (Fig. [4](#page-11-0)a, b) were computed from the ERA-Interim and RegCM3-10Km data in the area confined among 10° W–40° E and 30° N–50° N, during the 1981–2000 time span. Furthermore, the differences between the modelled and observed fields were mapped; the ranges of differences are also given in box plots (Fig. [4a](#page-11-0)ii, bii). For the same spatial window and for all the grid points included in it, HRP index was calculated to evaluate the efficiency of model performance for SLP (Fig. [4](#page-11-0)aiii, biii). In the case of January, Fig. [4](#page-11-0)ai illustrates that both simulated (model) and reanalysis (ERA-Interim) maps have the highest SLP values at the southwestern part of the Mediterranean and the lowest at the northwestern one. The distribution of differences (Fig. [4](#page-11-0)aii) shows that the model underestimates SLP over the continental parts of Europe (negative values), while smaller positive values are observed over the Mediterranean and southeastern parts of the study domain. Median differences are less than 1 hPa and inner-quantile range $(25-75\%)$ is between −1 and 4 hPa. The HRP index is higher than 0.95 for both the summer and winter indicative months over the entire Mediterranean Sea and a large part of it that covers the AIS, respectively (Fig. [4](#page-11-0)aiii, biii). It is also evident that the model adequately simulates the spatial distribution of the SLP values during July (characteristic summer month), with the lowest ones covering the eastern and southwestern parts of the spatial window examined; higher pressure values characterize central and western Europe. By examining the differences maps (Fig. [4](#page-11-0)aii, bii), it is found that RegCM3-10Km slightly overestimates SLP in the domain of study. The ability of the model in representing SLP values during the period 1981–2000 is confirmed by the use of the HRP index in almost all the parts of the domain of interest, where HRP is higher than the critical value of 0.95 (Fig. [4](#page-11-0)aiii, biii).

Hence, the simulated climatic data (SLP and winds) used as input for the specific aims of the present paper (i.e. climate simulations of storm surges, waves and their extremes) were considered to be in no imperative need of bias correction and that the dynamically downscaled RegCM3 implementation could efficiently reproduce wind and SLP characteristics in the AIS.

3.2 The wave model

A simulation scheme based on the SWAN wave model's version 40.91 (Booij et al. [1999](#page-33-0), Ris et al. [1999\)](#page-34-0) was developed for the wave climate simulation. SWAN is a "free" and opensource, third-generation (Young [1999\)](#page-34-0) phase-averaging wave model that solves the spectral action balance equation (Komen et al. [1994;](#page-33-0) Holthuijsen [2007\)](#page-33-0). The model simulates wave generation by wind, wave propagation, shoaling, refraction and diffraction, wave dissipation due to whitecapping, bottom friction and depth-induced breaking, interaction with obstacles, etc. (SWAN [2012](#page-34-0)).

The scheme uses one stage of nesting, leading to two simulation levels. Level I includes the entire Mediterranean Sea with resolution $0.2^{\circ} \times 0.2^{\circ}$ and level II includes an east-central part of the Mediterranean with resolution $0.05^{\circ} \times 0.05^{\circ}$ (Fig. [2](#page-6-0)b). The bathymetry is based on the General Bathymetric Chart of the Oceans (GEBCO, Becker et al. [2009\)](#page-32-0) for both levels. Level I simulation was forced by the RegCM3-25Km wind fields and level II simulation by the downscaled RegCM3-10Km fields (Section [3.1\)](#page-10-0). SWAN was executed in nonstationary mode with a 10-min time step and the Backward-Space-Backward-Time numerical integrator was used in both levels of implementation (SWAN [2012\)](#page-34-0). The basic configurations of the simulations are summarized in Table [1.](#page-9-0) The output of the scheme consisted of the SWH, H_s , mean (energy) wave period, T_{-10} , mean zero-crossing wave period, T_{02} , mean peak spectral wave period T_p (for level II) and mean wave direction for all "wet" points of the computational grids at 3-h intervals. The main reason for using SWAN instead of other models is that the finest simulation level (level III; results in selected coastal areas not presented herein) consisted of additional nested, nearshore, high-resolution simulations, where SWAN has improved physics features compared to other third-generation wave models and is known to perform better than them. In order to reduce the simulation scheme complexity, SWAN was also implemented in the Mediterranean and AIS simulations (levels I and II, respectively).

The simulation scheme was validated through systematic comparisons with an operational WAM (Cycle 4) implementation (courtesy of the Atmospheric Modelling and Weather Forecasting Group, University of Athens; Galanis et al. [2012\)](#page-33-0), due to unavailability of field data from buoys in the area. Initial comparisons indicated a negative bias in the mean wave periods predicted by SWAN (also documented in Rogers et al. [2003](#page-34-0), Van der Westhuysen et al. [2007](#page-34-0), SWAN [2012](#page-34-0)). Modifying the whitecapping dissipation term parameterization ("delta" in "GEN3" command equal to one) removed the aforementioned bias and the two models show good agreement (Fig. 5a–c). For further validation against measurements, the model was also driven with altimeter reanalysis winds (blended with model data) for the period 21 January–19 March 2009 (∼15,000 data pairs), and compared with corresponding H_s altimeter measurements obtained from AVISO [\(http://www.aviso.oceanobs.com/](http://www.aviso.oceanobs.com/)) (Fig. 5d). Model output displays quite acceptable agreement with the satellite altimetry measurements.

3.3 The storm surge model

For the storm surge simulations, the GreCSSM implementation was developed in order to numerically solve the depthaveraged shallow water equations in two horizontal dimensions. GreCSSM simulates the meteorologically induced sea-surface variations over the AIS on a $1/20^{\circ} \times 1/20^{\circ}$ (∼5 km) horizontal grid (parameterizations in Table [1](#page-9-0)). Sixhourly atmospheric forcing, i.e. winds at 10 m and SLP fields, was provided by RegCM3 simulations for the entire study period (1951–2100). GreCSSM domain (level II) has two sea boundaries one-way nested to MeCSSM (level I: $1/10^{\circ} \times 1/10^{\circ}$), implemented over the entire Mediterranean Sea (Androulidakis et al. [2015\)](#page-32-0).

The output of GreCSSM consists of atmospherically induced sea level variations, namely SLH. We investigated characteristic values of the largest SLH per year, using the Storm Surge Index (SSI; Conte and Lionello [2013](#page-33-0)). SSI is defined as the average of the three highest independent storm surge maxima per year. Only events separated by at least 120 h (estimation of the maximum duration of a storm in the AIS) are considered as independent storm events. The SSI was calculated at specific locations (study stations in Fig. [2](#page-6-0)c), for both simulated and observed time series, along with the corresponding Error Index (EI):

$$
EI = (\overline{S}\overline{SI}_{mod} - \overline{S}\overline{SI}_{obs}) / \sqrt{(\sigma_{SSI_{mod}}^2 + \sigma_{SSI_{obs}}^2)/2}
$$
 (1)

where the overbar denotes mean SSI values over the comparison period, as derived from modelled (mod) and observed (obs) field data, and σ is the standard deviation of the interannual variability of SSI time series for each station. EI is positive when the model overestimates the amplitude of the sea level against field data, obtained from the Hellenic Navy Hydrographic Service (HNHS; [http://www.hnhs.](http://www.hnhs.gr/portal/page/portal/HNHS) [gr/portal/page/portal/HNHS\)](http://www.hnhs.gr/portal/page/portal/HNHS). The field data from in situ observations (by digital gauges in Alexandroupoli, Chios and Lefkada; by analogue gauges in Thessaloniki and Heraklion) are daily averaged SLH values that were filtered in order to (a) remove the astronomical tide signals with T_ Tide (Pawlowicz et al. [2002\)](#page-34-0) and (b) exclude long-term (>30 days) oscillations of the sea level (Conte and Lionello [2013](#page-33-0)) due to steric effects, i.e. large-scale, low-frequency, thermohaline fluctuations and/or total mass variations of the Mediterranean basin (Carillo et al. [2012\)](#page-33-0). The SLH records have minimal gaps in their time series and cover the 18-year period of 1995 to 2012; thus, they refer to the last 6 years (1995–2000) of the reference period and also cover the incipient 12 years (2001–2012) of the current period.

Figure [6](#page-14-0) presents the evaluation of the GreCSSM simulations based on comparisons of model results against field observations at five stations. In the upper graphs, comparisons are based on averaged intra-annual maxima, i.e. mean SSI, and its EI followed by box plots of SSI (lower graphs). Comparisons support the good performance of the model, with rather small errors for the averaged SSI feature, i.e.

Fig. 5 Scatterplots of a H_s , b T_{-10} and c mean wave direction as calculated by SWAN and WAM models, using identical input $(4 \cdot 10^4$ data pairs); **d** scatterplot of H_s altimeter measurements vs. SWAN model

calculations forced by reanalysis input ($∼1.4 \cdot 10^4$ data pairs). Colour corresponds to point density in accordance with the colour bars

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Fig. 6 Validation of GreCSSM model output (grey colour) against field (in situ) observations (black colour) at five Greek stations covering an 18 year period (1995–2012). Comparisons are based on mean SSI (m) and EI

(upper left and right graphs, respectively) and box plots of SSI presenting the minima, maxima, medians and 1st and 3rd quartiles of SSI (lower graphs)

absolute EI is less than 0.8 in all stations. The most reliable model results, in terms of annual SLH maxima (SSI), are found in the regions of the North and South Aegean (Alexandroupoli and Heraklion) followed by the Thessaloniki and Chios stations. The largest simulation error (yet acceptable, $EI \approx 0.78$) is traced in the Ionian Sea station (Lefkada), which lies near the western boundary of the computational domain. The box plots show that the 18-year minima of SSI are well estimated by our model in all stations, while the 18-year maxima of SSI are overestimated everywhere except from Heraklion, where they are accurately reproduced compared to in situ values. The same analogy applies to the 18-year 1st and 3rd quartiles of the SSI time series.

Figure [7](#page-15-0) presents the inter-annual (18-year period) maxima, i.e. mid- and high-order (80th and 99th) percentiles of SLH (upper graphs), together with the box plots for the entire time series of modelled and observed SLH. The mid- and high-order (80th and 99th) percentiles of *SLH* show that modelled values are quite close to the field data, which is satisfactory in terms of GreCSSM evaluation for climatic simulations of extremes. The North Aegean station of Alexandroupoli ($EI = 0.045$) shows the best results compared to all other regions examined. The higher resolution of the GreCSSM simulation slightly improved the results of SLH fields in the AIS, as shown by Makris et al. [\(2015\)](#page-33-0), producing smaller errors over the Greek areas in comparison with the coarser MeCSSM simulation presented by Androulidakis et al. [\(2015](#page-32-0)). The box plots reveal that the 18-year quartiles and maxima of SLH are very well estimated by our model in all stations, while the 18-year minima of SLH (representing negative surges unimportant for the purposes of the present study) are underestimated by 10–15 % compared to in situ values everywhere except from Lefkada. Moreover, the probabilities of exceedance of coherent and intense events P_{coh} and P_{int} (%) are also shown in the lower graphs of Fig. [7.](#page-15-0) P_{coh} and P_{int} are heuristically defined statistical measures for coherent (coh) and intense (int) SLH events (Jaffe and Sallenger [1992,](#page-33-0) Cox and Kobayashi [2000\)](#page-33-0), which exceed certain critical (threshold) values, namely $SLH_{coh} > (m + \sigma)_{SLH}$ and SLH_{int} > $(m + 2\sigma)_{SLH}$; *m* is the mean of the *SLH* time series (1995–2012) and σ is the corresponding standard deviation. Simulated values of P_{coh} correlate very well with the ones corresponding to field observations in all stations. The simulated frequencies of intense events are slightly overestimated compared to the field data, yet differences are very small, i.e. in the order of 0.4∼0.9 %. Conclusively, the results of the model implementation verify the overall good performance of GreCSSM in terms of both intra-annual and inter-annual maxima for the evaluation period.

Furthermore we calculated the HRP index for the entire 18 year SLH time series in order to examine if bias correction is necessary for modelled storm surge results. The allowed deviation was taken equal to half the average standard deviation of the modelled and in situ SLH time series, i.e. $(\sigma_{SIHmod} +$ σ_{SLHobs})/2 \approx 4 cm that is 5–10 % of average observed SLH_{max}. It was found that HRP ranges from 0.95 to 1 in all Greek stations; therefore, bias correction was not imperative for modelled SLH.

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Fig. 7 Validation of GreCSSM model output (grey colour) against field (in situ) observations (black colour) at five Greek stations covering an 18 year period (1995–2012). Comparisons are based on mid- and high-order percentiles (80th and 99th; upper left and right graphs, respectively) of

SLH (m), box plots presenting the minima, maxima, medians, 1st and 3rd quartiles of SLH (mid graphs) and probabilities of exceedance of coherent and intense events P_{coh} and P_{int} (%) (lower left and right graphs, respectively)

3.4 Extreme value analysis

To analyse the marine climate extremes in eight areas of focus prone to coastal flooding (Fig. [2c](#page-6-0)), annual and monthly maxima of H_s and SLH at a number of grid points are used. Each area is divided in homogeneous parts in terms of the distribution of extremes, utilizing the homogeneity measures of Hosking and Wallis ([1997\)](#page-33-0) for the extracted maxima of H_s and SLH. Distinct grid points, representative of each homogeneous part, are selected and the respective extreme samples are further analysed. While all eight areas appear to be acceptably homogeneous in terms of their SLH extremes, H_s extremes impose the division of four areas in two homogeneous parts. Therefore, two grid points are selected for each of the marine areas of Alexandroupoli (northern Aegean), Lesvos (east-central Aegean), Parga and Kerkira (central and northern Ionian, respectively), whereas a single representative grid point is selected for the rest of the eight marine areas.

The wave height and storm surge extremes are studied using the univariate Extreme Value Theory (EVT) for 50 year time intervals (1951–2000, 2001–2050 and 2051– 2100). The family of univariate extreme value distributions includes models for maxima of appropriately defined groups (e.g. distribution functions for annual or monthly maxima), as well as models for exceedances over high enough thresholds, i.e. Peaks Over Threshold (POT) models. The former correspond to the generalized extreme value (GEV) distribution function (Coles [2001\)](#page-33-0) with parameters μ (location), σ (scale) and ξ (shape). To incorporate the seasonal component in the stationary GEV distribution, each parameter can be represented as a harmonic function of time of the form presented by Menéndez et al. [\(2009\)](#page-34-0). The optimum number of harmonics used in each of the three parameters is assessed by minimizing the Akaike criterion (AICc) with correction for small sample sizes (Hurvich and Tsai [1989\)](#page-33-0), as well as by the deviance statistic function D (Coles [2001\)](#page-33-0).

When considering processes with time-dependent properties, the return level (z) is perceived as the quantile of the fitted distribution at a certain time of a given year; therefore, it is assumed to vary with time, i.e. $z_p(t)$ for an exceedance probability p. Annual return levels, z_n , corresponding to a certain exceedance probability, p , can be calculated by iteratively solving the Cumulative Distribution Function (CDF) of the GEV distribution, expressed as a function of time-varying parameters and quantiles integrated over an entire year (Menéndez et al. [2009\)](#page-34-0). Results for different return periods, $T = 1/p$, can be presented in a return level plot for the interpretation of stationary extreme value models.

3.5 Bias correction for marine characteristics

Simulations of the marine climate using RCM forcing may be subject to bias, which represents the error component of the climatic model (Haerter et al. [2011](#page-33-0)). Among the bias correction techniques, quantile mapping methods are indicated as the most efficient, even for the most extreme part of the distribution of the studied variables (Themeßl et al. [2012](#page-34-0)). The methods used in the present work include both parametric (linear, polynomial, scale or power transfer functions) and non-parametric (cubic smoothing splines) quantile-quantile transformations (Gudmundsson et al. [2012\)](#page-33-0). In the present study, bias correction is considered necessary only for the analysis of wave height extremes; the HRP index for SLH is found to be over 0.95. The main reason is that significant differences are noticed between the tails of the CDFs of the SWAN results and observations or WAM simulations of wave heights. Because of the very short continuous series of observed data of wave heights in the areas of interest, only simulated SWH fields are utilized for bias correction purposes. Therefore, wave predictions by the WAM model forced with the non-hydrostatic model SKIRON weather forecast input (Kallos et al. [1997](#page-33-0), Papadopoulos et al. [2002](#page-34-0)) are used for all study areas of focus. The modelled data cover a period of ten years and are provided with an hourly time resolution. The horizontal spatial resolution of SKIRON and the wave prediction model WAM is $0.05^{\circ} \times 0.05^{\circ}$ matching level II of our SWAN simulations; all selected SWAN grid points are fitted to the ones of WAM. Some examples of post-processing (bias correction) of wave and storm surge data in the literature can also be found in Marcos et al. ([2011](#page-34-0)), Benetazzo et al. [\(2012\)](#page-32-0) and Charles et al. [\(2012\)](#page-33-0). According to Charles et al. [\(2012\)](#page-33-0), even in case studies of using climatic parameters as forcing input in e.g. wave models, it is suggested that the bias correction (if unavoidable) should be applied only to the wave fields and not to the simulated wind data. This kind of practice could prevent crucial modifications of the local atmospheric circulation patterns that are essential to RCM simulations, and thus was also followed herein.

4 Present climate and future projections of atmospheric and marine characteristics

4.1 Analysis of wind and sea level pressure fields

SLP and wind (speed and direction) fields simulated by RegCM3 are used in the present analysis for the study of the AIS climate. Results from the model's simulations are compared with the general atmospheric circulation patterns in the Mediterranean and the prevailing wind patterns in the AIS. The future projections are used for the assessment of the possible changes in the characteristics of the SLP and wind patterns.

4.1.1 Sea level pressure

RegCM3 quite satisfactorily simulates the general atmospheric circulation over the Mediterranean. Figure [8](#page-17-0) shows the high-pressure system above the Iberian Peninsula and western Europe due to the extension of the Azores high, as well as its displacement throughout the year. Similarly to the Azores high, the extension of the Icelandic low is quite evident in northwestern Europe with low pressure values (Fig. [8](#page-17-0)a1). The European and the Balkan Peninsula anticyclones are combined into a continuous high pressure system above central Europe and the Balkan Peninsula, respectively. Moreover, the Siberian high pressure system during the cold period is modified to the Asian thermal low during the warm period. In the southern part, the West African heat low is apparent during summer with low pressure values above West Africa. A southerly migration of the West African heat low is also observed in the cold period.

For the current period (2001–2050), a reinforcement of high pressure values in western Europe and the Iberian Peninsula and a weakening of low pressure values northwest of Europe are observed during January. Analogous were the results of Santos et al. ([2007](#page-34-0)), who used a different RCM and found that a reinforcement and a swift to the east is expected for the Azores high (southern pole of NAO index) during winter in the future. There is no significant change of the pressure gradient above the Balkan Peninsula, South Asia and western Africa (Fig. [8](#page-17-0)b1). In spring, and especially in April, the attenuation of low pressure values northwest of Europe and high pressure values above West Africa and the Iberian Peninsula reveal the displacement of the Azores high (not shown). High pressures are enfeebled in central Europe during summer, while low pressures are decreased in Asia, Middle East and West Africa, i.e. the Asian thermal low and the West Africa heat low are respectively deeper. These findings are in agreement with Anagnostopoulou et al. ([2014\)](#page-32-0), who showed that there is a strengthening of the two aforementioned synoptic centres for the future period. This is quite obvious in July (Fig. [8b](#page-17-0)2). This atmospheric circulation system results to moderate Etesian winds over the Aegean Sea, due to the moderate pressure gradient. However, there is a strengthening of the high pressure system over central Europe and the Balkan Peninsula in August (not shown). Furthermore, the positive centre extents from western to central Europe during autumn, mainly during October (not shown). Similar results are found for the future period (2051–2100) (Fig. [8c](#page-17-0)1, c2). Differences of pressure gradient between the future and the reference period are more intense compared with the ones between the current and the reference period (Fig. [8](#page-17-0)b1, b2). In particular, small differences are

Fig. 8 a Mean SLP (hPa) maps for the reference period (1951–2000). Maps of differences for mean SLP (hPa) b between the current period (2001–2050) and the reference period; c between the future period (2051–

 2100) and the reference period for (1) January (characteristic month of cold period) and (2) July (characteristic month of warm period)

mainly evident in June, when a rise of high pressures is evident at the northwest of and above central Europe. Eventually, a reinforcement of high pressures is noticeable above Greece (Aegean Sea) and the Middle East in December.

4.1.2 Wind climate

In the North Aegean Sea, the wind direction does not vary significantly throughout the year and is mainly northeastern (Fig. [9a](#page-18-0)1, a2). The wind speeds range between 7 and 8 m/s in the cold period and 5 to 7 m/s in the warm period. In the central Aegean Sea, the wind speeds increase slightly, while generally winds become northerly throughout the year. The prevailing wind direction in the South Aegean Sea is mainly northern during the year, apart from spring, during which the winds blow from the West (not shown). The winds are steadily blowing from the Northwest in the Southeast Aegean. In the Ionian Sea, winds seem to gradually shift from westerly to northerly for all three 50-year periods (Fig. [9](#page-18-0)a1, a2; b1, b2; c1, c2). In the southern AIS the wind velocities are consistent during the year as they range from 7 to 9 m/s; there is an exception during summer (sc. July) when wind speeds in the Ionian Sea are not that intense.

Changes of the 50-year patterns of wind speed and direction in the AIS are computed with respect to the reference period. The wind directions in the first half of the twentyfirst century are similar to the ones of 1950–2000. During the warm period of the year, winds in the South Aegean Sea

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Fig. 9 a Mean wind speed (m/s) and prevailing wind directions maps for the reference period (1951–2000). Maps of prevailing wind directions and relative differences for mean wind speed (%) b between the current

period (2001–2050) and the reference period; c between the future period $(2051-2100)$ and the reference period for (1) January (characteristic month of cold period) and (2) July (characteristic month of warm period)

are mainly blowing from the West, whereas in the cold period of the year the prevailing winds shift to northerly. January is characterized by a slight increase of wind speed across the study area (Fig. 9b1) that reaches 5 % in the Ionian Sea, whereas wind speeds decrease in the major part of the study area during the rest of winter. During the warm period, there are obvious differences in wind patterns between the Ionian and the Aegean Seas. The relative differences between wind

speeds are mainly negative (Fig. [9](#page-18-0)b2) during summer (sc. in July). Mclnnes et al. [\(2011\)](#page-34-0) used numerous general circulation models and also found that a reduction of the mean wind speed is expected during winter in the Ionian and the southern Aegean Sea towards the end of the twenty-first century, while they estimated an increase of mean wind speed over Greece during summer.

Similar results are derived regarding the wind directions (Fig. [9](#page-18-0)c1, c2) for the future period. In January, and also during the entire winter season, wind speeds decrease across the study area (Fig. [9](#page-18-0)c1). During summer and spring, the wind speeds increase in the Aegean Sea (e.g. more than 10 % in June; not shown). Negative values are observed in the Ionian Sea, which are more intense in July, i.e. about −10 % in the southwestern Ionian Sea (Fig. [9c](#page-18-0)2). A decrease is also detected in the South Aegean Sea for the warm period (July). In autumn, a reduction of wind speeds is noted across the study area, which reaches 10 % in the Ionian Sea apart from September, during which a reinforcement of wind speed (about 10 %) is observed in the central and southern Aegean Sea (not shown).

For a more detailed investigation of the wind patterns, the wind roses for three subregions are presented; one representative grid point per selected subregion is analysed. The colour scale in the wind roses (Fig. 10) corresponds to the magnitude of the wind velocity, which ranges from 1 to 16 m/s and the numbers in the axis are percentage of cases with a certain wind direction. In the North Aegean Sea, there are two main (opposite) wind directions, namely the northeastern and southernsouthwestern. Southerly to southwesterly winds are observed only during winter (January) and spring (not shown), whereas northeasterly winds are observed all through the year (Fig. 10a1, a2). The wind speeds range from 7 to 10 m/s with 4 % of the cases varying from 10 to 13 m/s.

On the contrary, the occurrence frequency of wind speeds between 7 and 10 m/s is about 14 % in summer (sc. July). Similar results are derived for the current and future periods (Fig. 10b1, b2, c1, c2). In the South Aegean Sea, the main winds are of a northern-northeastern component during the cold period (January), nevertheless there are many cases that shift from westerly-northwesterly to southwesterly directions in all three periods (Fig. 10a3, b3, c3). Regarding the warmer period of the year (July), the winds shift from northerly to northerly-northeasterly in all three periods (Fig. 10a4, b4, c4). The main observed wind velocities belong in the class of 7–10 m/s. The Ionian Sea is affected by the winds that blow from North, West and South, due to the presence of the land and the western orientation of the coastal zone (Fig. 10a6, b6 and c6).

4.2 Analysis of mean and extreme waves

The results of the SWAN simulations are presented and discussed concerning the mean and extreme wave climate of the AIS for the reference, current and future periods. Concise information of the Mediterranean (level I) wave field simulations is also presented.

Fig. 10 Wind roses for the three areas denoted by blue stars in Fig. [2](#page-6-0)e, i.e. of the North Aegean Sea, the South Aegean and the Ionian Sea; a for the reference period (1951–2000), b for the current period (2001–2050)

and **c** for the future period (2051–2100) during the cold period $(1, 3, 5)$ and during the warm period $(2, 4, 6)$ of the year

4.2.1 Analysis of mean wave regime

The mean wave climate results have been subdivided in two parts: a high-energy season (months November to April) and a low-energy season (months May to October), based on the mean-monthly wave energy in the east-central Mediterranean. Results for the entire Mediterranean basin (level I; not shown) lead to estimations of a general incipient increase and gradual decrease of the mean H_s field in the twenty-first century (current and future periods), compared to that of the reference period; lowest values appear during the second half of the twenty-first century. This effect is stronger in the three subregions of the AIS, where the H_s difference between the future and the reference period is of the order of 0.25 m, for the high-energy season. The seasonal patterns of mean-monthly H_s and T_{-10} for the three periods at three characteristic offshore (western, central and eastern) locations in the Mediterranean Sea show a strong correlation between the two and a slight reduction of mean H_s and T_{-10} during the high-energy months especially for 2051–2100. The values of wave characteristics reveal a firm pattern of west-toeast decrease. In general, the forms of the seasonal patterns are almost invariable for the three periods in all locations.

Level II results for the 50-year mean and averaged annual maxima of the H_s field in the AIS are presented in Figs. 11 and [12,](#page-21-0) respectively. An overall slight decreasing trend of mean H_s is also observed for the high-energy season in level II (Fig. 11, upper row). The Ionian and Libyan Seas are significantly affected, including the regions near the Greek mainland; a similar tendency, yet with weaker magnitude, is noticeable in the central part of the North Aegean Sea and the region north of Crete. Results for the low-energy season are also shown in Fig. 11 (lower row). The 50-year changes of mean H_s fields are reversed for the warm period of the year. In the Ionian and the North Aegean Seas, the fields are seemingly invariable through time. However, in contrast to the general trend, an increase of the mean H_s (up to 0.20 m locally) is observed in the southeastern and central Aegean Sea for the future period, especially at the parts surrounding the island group of Cyclades and near the Crete-Karpathos strait. This is associated with the corresponding increase of the Etesian winds at the central part of the Aegean in the same period. The latter is the main probable cause for the change of patterns in fields of H_s annual maxima (Fig. [12,](#page-21-0) upper row). Specifically, $H_{s,max}$ values are estimated to intensify in the northern and central

Fig. 11 Temporal mean of SWH, $H_{s,mean}$ (m), during high-energy (*upper row*) and low-energy (*lower row*) months over the AIS for 50-year time intervals, i.e. the reference (left graphs), current (central graphs) and future (right graphs) periods

Fig. 12 Temporal mean of annual maxima of SWH, $H_{s,max}$ (m) and during high-energy (*upper graphs*) and low-energy (*lower graphs*) months over the AIS for 50-year time intervals, i.e. the reference (left graphs), current (central graphs) and future (right graphs) periods

parts of the Aegean Sea, with smaller values in southern AIS. There is also a clear increase of H_s yearly maxima in the Ionian and Libyan Seas during the current period and a consequent attenuation in the second half of the twenty-first century, following the changing patterns of mean H_s . $H_{s,max}$ fields are mainly time-invariant during the low-energy seasons in the entire study area.

The seasonal patterns of mean-monthly H_s and T_{-10} for the three periods at three characteristic offshore stations in the North Aegean, South Aegean and Ionian (denoted by blue stars in Fig. [2e](#page-6-0)) are presented in Fig. [13](#page-22-0)a (left panels). Local probability density functions (PDFs) of the wave parameters $(H_s$ and T_{-10}) at the same stations are shown in Fig. [13b](#page-22-0) (right panels). PDFs are computed by fitting a log-normal distribution to the data. The shapes of seasonal distributions of wave heights and periods remain unchanged unlike their magnitudes. The peaks of modelled energy spectra seem to shift to higher frequencies and smaller powers in the twenty-first century. Thus, the mean field patterns are estimated to give slightly smaller and shorter waves in the AIS from the reference to the current and future periods; this follows the general storminess attenuation trend.

The polar probability plots for the mean wave directions (not shown), produced via kernel density estimation utilizing wrapped-Gaussian kernels (Athanassoulis and Belibassakis [2002\)](#page-32-0), show that the probability of waves coming from Northeast is gradually increased during the low-energy season of the current period and more keenly for the future period.

4.2.2 Analysis of extreme waves

Wave height extremes are analysed in eight selected areas of the AIS prone to coastal flooding (Fig. [2](#page-6-0)c), using the extreme value techniques presented in Section [3.4](#page-15-0), following the bias correction of wave data and extracting monthly SWH maxima (Section [3.5\)](#page-16-0). Only events separated by at least three days (estimation of the representative duration of a storm and consequent rough sea state in the AIS) are considered as independent ones. 26 nonstationary GEV distribution functions with up to two harmonic functions in all model parameters are fitted to the data of each area and period, and the best-fit model is conditionally selected.

The study areas in the subregions of the AIS, viz. in the Ionian, the northern and the southern Aegean Seas, are

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Fig. 13 a Seasonal patterns of H_s (m) and T_{-10} (s) at three offshore stations in the North Aegean, South Aegean and Ionian from upper to lower graphs denoted by blue stars in Fig. [2](#page-6-0)e (left-panel graphs); **b** probability density functions (pdf) for H_s and T_{-10} for the high-energy

(full lines) and low-energy (dashed lines) seasons at the same three stations (right-panel graphs); all distributions (coloured lines) refer to 50-year time intervals of the reference, current and future periods

characterized by distinct structures of the nonstationary GEV distribution function. More specifically, the areas of Chania and Heraklion present similar model structures with one harmonic in the location and scale parameters for the reference period. Two and one harmonics in the location and the scale parameters are used, respectively, for the reference and future periods. The majority of the selected models for wave height extremes analysed in the three study areas of the Ionian Sea (Parga, Kyparissia and Kerkira) present one harmonic in the location parameter and two harmonics in the scale parameter of the GEV distribution function for all three periods. For the respective areas in the North Aegean Sea (Alexandroupoli, Katerini and Lesvos) harmonic functions appear also in the shape parameter of the GEV modifying the tail behaviour of the wave height extremes within the year.

Figure [14](#page-23-0) presents the 98 % wave height quantile levels, corresponding to a return period of 50 years, in a time interval of one year and for all three periods considered in the marine areas of Alexandroupoli, Heraklion and Kyparissia (Fig. [2](#page-6-0)c). The maximum likelihood estimates (*MLEs*) of the quantiles are represented with a solid line whereas the shaded areas correspond to the 95 % confidence intervals estimated using the delta method. The monthly maxima of each sample in chronological order are also included as points. For the marine area of Alexandroupoli, peaks in extreme wave height quantiles appear at the end of autumn or within the winter season for the reference and the current period. Apart from the highest peak in November, a second peak is also apparent in mid-spring season for the future period. The auxiliary peak is accompanied with increased uncertainty in extreme H_s estimates. The respective H_s quantile levels in the other study areas of the North Aegean Sea (Katerini and Lesvos; not shown) reveal peaks in the middle or at the end of the winter period for all three periods considered. For the marine area of Heraklion, the 98 % wave height quantiles present single peaks in the middle and at the end of the winter season for the reference and the other two (current and future) periods, respectively. For the marine area of Kyparissia and the rest of the study areas in the Ionian Sea (not shown), the highest extreme H_s quantiles appear mostly in the winter season for all three periods. A prolonged peak period for wave height extremes, covering almost four months, is noticed for the future period.

Figure [15](#page-24-0) shows the annual wave height return levels of return periods between 2 and 200 years in the marine areas of Alexandroupoli, Heraklion and Kyparissia for the three 50 year periods, shown in successive pairs (1951–2000 with 2001–2050, 2001–2050 with 2051–2100). In the marine area of Alexandroupoli, an increase in the severity of extreme wave events is obvious in the current period. This increase in MLEs of extreme wave heights exceeds 14 % for a return period of 50 years, compared to the reference period conditions. Higher

Fig. 14 Ninety-eight percent significant wave height (H_s) quantiles within a year for the marine areas of Alexandroupoli, Heraklion and Kyparissia. from top to lower graphs. Panels correspond to a reference, **b** current and c future periods, from left to right

increases are observed for the upper 95 % confidence limits of the return level estimates. However, for the future period a decrease in extreme wave heights is evident, compared to those of the current period, especially for events with a high probability of occurrence. For a return period of 50 years, the extreme wave heights in the future period are more than 10 % higher compared to the respective estimate for the reference period. Moreover, the uncertainty represented by the range of the return level confidence interval also appears higher for the future period. In the marine area of Heraklion, climate change effects on extreme wave heights are not obvious. Extreme wave heights are almost stable for the current and reference periods estimates, whereas a slight decrease in extreme H_s can be noticed for the future period. In the marine area of Kyparissia, increases in extreme H_s of the current period are evident (exceeding 14 % for 50-year return period). H_s extremes appear reduced in the future period compared to those

of the first half of the twenty-first century, but still higher (over 6 % for 50-year return period) than the respective ones of the reference period.

4.3 Analysis of storm surge intra- and inter-annual extremes

The results of GreCSSM are presented and discussed concerning the evolution of extreme sea levels due to storm surges from 1951 to 2100. Indicative intercomparisons of results (SSI, annual SLH maxima and inter-annual extremes) for three 50-year periods are provided.

4.3.1 Regional analysis

The present and future, intra- and inter-annual variability of SLH maxima in the entire Mediterranean Sea (level I) was

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Fig. 15 Annual return levels of significant wave height (H_s) for the marine areas of Alexandroupoli, Heraklion and Kyparissia, from top to lower graphs. Comparisons of the reference period (1951–2000) against the current period (2001– 2050) and the current against the future period (2051–2100) are given in the left and right graphs, respectively. Dashed lines correspond to MLEs and solid lines to the upper and lower 95 % confidence bounds

investigated by Androulidakis et al. [\(2015\)](#page-32-0). The SLH maxima were estimated to increase during 2001–2050 compared to those during the reference period. This increase is expected to relax in the future period. Their results also indicate that the maximum surges increase by almost 3.5 % in the current period, compared to those of the reference period, whereas they are estimated to decrease by an average of 7 % for 2051–2100 compared to those of 2001–2050 over the entire Mediterranean Sea. The projected attenuation of storminess over the eastern Mediterranean basin under the SRES-A1B scenario, also suggested by other researchers (Conte and Lionello [2013,](#page-33-0) Marcos et al. [2011\)](#page-34-0), was reflected in their results with a reduction of average storm-induced sea level (SLH_{mean}) throughout the twenty-first century (of the order of 17 % and 5 % for the current and future periods, respectively).

Based on the results of the GreCSSM simulations (level II), Fig. [16](#page-25-0) shows the corresponding horizontal distributions of maximum and average (upper and lower graphs, respectively) SLH for the three periods. In general a significant increase of SLH maxima is estimated for the first half of the twenty-first century, compared to those of the reference and the future

Fig. 16 Horizontal distribution of maximum (upper graphs) and average (lower graphs) SLH (m) in the study area for the reference (1951–2000), current (2001–2050) and future (2051–2100) periods (from *left* to *right*)

periods. Magnitudes range between 0.60 and 0.85 m in the North Aegean Sea with higher values along the northern coasts, while the corresponding values for the reference period are of the order of 0.50–0.55 m. In the southern AIS, SLH maxima are estimated to range between 0.50 and 0.60 m in 2001–2050, whereas the values of the reference period are found to be almost 10 cm lower. Towards the end of the twenty-first century, the peak SLH values reduce significantly in most parts of the study area, ranging from 0.50 to 0.60 m in the North Aegean Sea and from 0.40 to 0.50 m in the Ionian Sea. Surge maxima are estimated to remain similar to the levels of the current period over the northeastern part of the South Aegean and western Crete. Moreover, an attenuation of storminess and related surge maxima is expected for the AIS during 2051–2100. Nevertheless, the magnitude of extreme surges is expected to increase during the first half of the twenty-first century (30 ∼ 40 % in North Aegean). The spatiotemporal variability of average surge-induced sea level (Fig. 16, lower graphs) reveals that there is a stable pattern of SLH_{mean} with increasing values from West to East. Although there are no distinct differences between the reference and the current period, a strong decrease of SLH_{mean} values can be observed for the second half of the twenty-first century.

The representative annual maxima of *SLH* that may occur for the current and future periods can be described by SSI (Section [3.3\)](#page-13-0). Figure [17](#page-26-0) presents the averaged (for each of the three periods) values of annual SSIs over each 50-year period (SSI_{50-vr}) . The graphs refer to the spatial variability of $SSI_{50\text{-year}}$ along the coastal zone of the study area, including the entire Greek coastline and the coasts of Anatolia and North Africa that surround the Aegean and Libyan Seas, respectively. The spatial distribution pattern of $SSI_{50-\text{yr}}$ is similar to that of annual SLH maxima in the preceding discussion for each particular coastal region investigated. The highest SSI values (>0.4 m) can be traced along the northern coasts of the Aegean Sea (coastal zone of Alexandroupoli). Values decrease from North to South, ranging from 0.32 to 0.38 m for the central parts of the AIS, falling to almost 0.3 m in the southern part of the AIS (South Aegean and Crete), and below 0.25 m for the northern African coasts. The temporal evolution of $SSI_{50\text{-}year}$ values shows significant regional differences mostly in the 2051–2100 period; lower values occur along the entire

Fig. 17 Storm Surge Index SSI (m) along the coastline of the study area, time-averaged over the 50-year reference, current and future periods (from left to right)

coastline, consistent with the estimated storm attenuation during the future period. The change in $SSI_{50\text{-year}}$ between the first half of the twenty-first century and the reference period are generally low, ranging from −1.4 to +0.8 cm (differences of −5.1 % to +19.6 %) with an average value of −0.6 cm (1.6 % decrease). Storm surge events may be more infrequent in the current period resulting to averaged $SSI_{50-\rm vr}$ values of similar levels with those of the reference period, yet higher surge maxima may occur during 2001–2050 (Fig. [16](#page-25-0)). SSIs generally decrease from the current to the future period, with differences between −4.7 and 0.02 cm (changes of −17.5 % to +1.8 %) and a $-$ 2.6 cm average *SLH* (8 % decrease).

Figure [18](#page-27-0) presents the average duration in hours (red curves) and the average number of grid cells (blue curves), i.e. the spatial coverage, of storm surge events with SLH values exceeding the severe event threshold. The latter is defined statistically by $(m +$ 3σ _{SLH,obs} \approx 30 cm based on in situ measurements at five Greek stations for an 18-year period (see also Section [3.3\)](#page-13-0); Fig. [18](#page-27-0) graphs refer to each of the main subregions of the study area (Fig. [2c](#page-6-0)). By setting the confidence level at 95 $%$ (p values <5 %) for the Mann-Kendall test, only the statistically significant monotonic trends are indicated with straight lines for each parameter, separating the reference period from the twenty-first century; values of the corresponding linear trend slopes are also noted on the graphs. The maximum values of storm surges' spatial coverage are observed in the central part of the Aegean Sea, while the most frequent high-duration surges over the severe event threshold are estimated to occur in the Ionian Sea. During the reference period no distinctive trend is observed, both in terms of duration and coverage in all regional seas, apart from the North Aegean, where a strong decrease in both factors can be noticed. In contrast, both parameters decrease for the SRES- A1B-based run throughout almost the entire domain. The only exception is the North Aegean region, where no statistically significant trend (based on the Mann-Kendall test) exists for the spatial coverage of storm surges. This decreasing tendency is in agreement with the projected storminess attenuation. However, even though the general future trends decrease, short-term peaks are observed in the time series that exceed the values of the past climate. For example, the total annual duration of storms in the southwestern part of the study domain (e.g. the Ionian Sea) shows maxima that are higher than the respective ones of the reference period, especially in the current period; the corresponding maximum spatial coverage values remain at similar levels. On the other hand, in the South Aegean the largest peaks in spatial coverage are estimated to occur during 2001–2050, marginally exceeding the ones of the reference climate. In the North Aegean Sea, the values of storm surges' spatial coverage generally fluctuate over the same range in the entire twenty-first century. Future trends in both the spatial coverage and the duration of storm surges are generally estimated to decrease. Nevertheless there is a high possibility of short-term surge events with higher duration and/or coverage in parts of the domain, especially in 2001–2050.

The occurrence frequency of annual SLH_{max} per season is also calculated at all stations for the three 50-year periods, in order to investigate potential changes in the seasonal variability of annual storm surge maxima. As expected, most of the large events take place during winter and spring for all stations. The simulation output shows a decrease of winter frequencies in the second part of the twenty-first century, along with a corresponding increase of spring values, throughout almost the entire AIS region. No summer storm surge maxima are reproduced in any of the study periods. Therefore,

Fig. 18 Annual duration (h) (red curve with triangles) and corresponding average number of model cells (blue curve with dots) with SLH > $(m + 3\sigma)_{SLH,obs}$ ≈ 30 cm for the main subregions of the AIS (see Fig. [2e](#page-6-0)). Linear trends with 95 % confidence level (straight lines) for each

parameter, divided in the reference period and the entire twenty-first century; values of trend slopes noted on the plots with corresponding colour

modelling results show a general increase in the range of the seasonal cycle of storm surges, with a decrease of winterautumn and an increase of spring frequencies. These findings are in agreement with Jordà et al. ([2012](#page-33-0)).

4.3.2 Analysis of extreme storm surges

A similar approach used for the wave height extremes (Section [4.2.2\)](#page-21-0) is utilized for the storm surge monthly maxima. The best-fit nonstationary GEV models, describing the variability of monthly extremes for storm surge events, present fewer differences in their structure among the selected areas of the AIS, compared to the ones used for the wave height extremes. Especially for the future period, GEV distribution functions have one harmonic in their location parameter (μ) , two harmonics in their scale parameter (σ) and a constant shape (ξ) , in almost all study areas. For the reference period an annual cycle (single harmonic) is evident in the

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location and shape parameters, whereas both the annual and seasonal cycles are considered statistically significant (based on the deviance statistic D) for the scale parameter. The shape parameter of the GEV is kept constant only for the areas in the South Aegean Sea (Heraklion and Chania). For the current period the dominant models in the North Aegean Sea (Alexandroupoli, Katerini and Lesvos) are characterized by two harmonics in the parameters μ and σ and by one harmonic in ξ. For the same period in the South Aegean Sea, the seasonal cycle in ξ is also considered statistically significant (based on D). In the Ionian Sea some differences are found in the best-fit models of the three areas of focus (Parga, Kyparissia and Kerkira), mainly detected in the number of harmonics in ξ .

Figure 19 presents the 98 % storm surge quantile levels corresponding to a return period of 50 years within a

stationary context in a yearly time interval for all three periods considered in the marine areas of Alexandroupoli, Heraklion and Kyparissia. MLEs of quantiles are represented with a solid line and the shaded areas correspond to the 95 % confidence intervals estimated using the delta method. The monthly maxima of each sample in chronological order are also included as points. A peak of the 98 % storm surge quantile is observed in December for the reference period in all three study areas of the North Aegean Sea. Extreme storm surges decrease quite slowly during winter and until the end of spring. For the same period in the study areas of the South Aegean and the Ionian Sea, the peak of the extreme storm surges appears within and at the end of winter, respectively. Storm surge extremes present mild changes during the entire winter period until midspring. During the current period, the peak of the extreme storm surges in the study areas of the North Aegean Sea is

Fig. 19 Ninety-eight percent storm surge (SLH) quantiles within a year for the marine areas of Alexandroupoli, Heraklion and Kyparissia, from top to lower graphs. Panels correspond to a reference, **b** current and **c** future periods (from *left* to right)

observed at the end of winter and is more prominent compared to the other periods. In the South Aegean Sea and in most of the study areas in the Ionian Sea, the peak of the extreme storm surge quantile appears in mid-spring. Especially for the marine areas of Heraklion and Chania (South Aegean Sea), the uncertainty of the peak storm surge quantiles in this interval is significantly increased. For the future period, the study areas in the North Aegean and the Ionian Sea present similar characteristics. There is a quite elongated time span that covers the period of peak values and extends up to the

first spring months, where the storm surge quantile variation is insignificant. On the other hand, in the study areas of the South Aegean Sea the peak of the extreme storm surge quantile in the future period appears in mid-spring, but the uncertainty that accompanies these estimates is significantly reduced.

Figure 20 presents annual storm surge return levels of return periods between 2 and 200 years in the marine areas of Alexandroupoli, Heraklion and Kyparissia for the three 50-year periods shown in successive pairs

Fig. 20 Annual return levels of storm surges (SLH) for the marine areas of Alexandroupoli, Heraklion and Kyparissia, from top to lower graphs. Comparisons of the reference (1951–2000) against the current (2001–2050) period and the current against the future (2051–2100) period are given in the left and right graphs, respectively. Dashed lines correspond to MLEs and solid lines to the upper and lower 95 % confidence bounds

(1951–2000 with 2001–2050, 2001–2050 with 2051– 2100). It is evident that there is an increase in extreme storm surges in the marine area of Alexandroupoli for the current period with respect to those of the reference period. This increase in storm surge MLEs is estimated at almost 15 % for a return period of 50 years. For the future period, there is a decrease of the extreme storm surges in the area, compared to those of the current period, exceeding 13.5 % for a return period of 50 years. Therefore, the SLH return level estimates for 2051– 2100 are close to the ones extracted for the reference period. These findings are in agreement with the discussion in Section [4.3.1](#page-23-0), regarding annual SLH maxima. In the marine area of Heraklion extreme storm surges present an increase in the current period, compared to those of the reference period, reaching almost 7 % for a return period of 50 years. The range of the 95 % confidence interval is almost doubled (the extreme value distribution fitted to SLH extremes belongs to the domain of attraction of a Fréchet distribution), compared to the respective estimates for the reference period (the extreme value distribution fitted to SLH extremes belongs to the domain of attraction of a Weibull distribution), significantly raising the return level uncertainty. Storm surge return level estimates and confidence intervals are significantly reduced in the future period. In the marine area of Kyparissia, there is stability in MLEs of extreme storm surges for the reference and the current period. Slight increases can be observed for the latter only for sufficiently high return periods; thus, the following results correspond to analysis based on a 50-year return period. The range of the 95 % confidence interval for the current period appears increased by almost 65 % (the extreme value distribution fitted to SLH extremes belongs to the domain of attraction of a Fréchet distribution), compared to the respective estimate for the reference period (the extreme value distribution fitted to SLH extremes belongs to the domain of attraction of a Weibull distribution). During the future period, there is a decrease of extreme storm surges reaching 13 % for a 50-year return period compared to the other two periods.

4.4 Climate change signals

In order to gain a more general insight on the climate change signals of the storm-induced sea-surface dynamics in the AIS during the twenty-first century, we use the Climate Change Index (CCI). CCI is calculated on the coastal zone concerning the storm surges, and over entire subregions of the AIS concerning the wave fields. For example the CCI of intra-annual storm surge maxima SSI on every coastal cell of the AIS numerical domain and through each of the current and future 50 year periods in reference to 1951–2000 is given by

$$
CCI_{SSI,Future} (\%) = 100 \cdot \frac{\left(\overline{SSI_{mod}^{[Future Period]}} - \overline{SSI_{mod}^{[Reference Period]}}\right)}{\left(\overline{SSI_{mod}^{[Reference Period]}}\right)}
$$
\n
$$
CCI_{SSI, Current} (\%) = 100 \cdot \frac{\left(\overline{SSI_{mod}^{(Current Period)} - \overline{SSI_{mod}^{(Reference Period)}}}\right)}{\left(\overline{SSI_{mod}^{(Reference Period)}}\right)}
$$
\n
$$
\left(\overline{SSI_{mod}^{(Reference Period)}}\right)
$$
\n(2)

where the overbar denotes temporal (50-year) averages of SSI calculated along the coastal zone of the main subregions (Fig. [2](#page-6-0)c) of the AIS. CCI is then spatially averaged over all of the subregion's nearshore marine cells. The $m \pm \sigma$ (σ of CCI values is the standard deviation in spatial terms) values of $CCI_{SSI, current}$ are -2.48 ± 1.24 %, -0.65 ± 0.93 % and -2.09 ± 0.47 %, for the Ionian, North and South Aegean, respectively. These values reveal a general small decrease of storm surge annual maxima with a miniscule possible increase only in the North Aegean for the current period (2001–2050). The respective $m \pm \sigma$ values of $CCI_{SSI, future}$ are -10.11 ± 1.08 %, -7.17 ± 1.46 % and -9.94 ± 1.02 %. Thus, a general clear attenuation of storm surge annual maxima is expected on the entire coastal zone of the AIS for the second half of the twenty-first century. This is qualitatively consistent with the findings of Marcos et al. [\(2011](#page-34-0)), Jordà et al. ([2012](#page-33-0)), Lionello et al. ([2012](#page-33-0)), Šepić et al. ([2012\)](#page-34-0), Conte and Lionello ([2013](#page-33-0)), Androulidakis et al. ([2015](#page-32-0)).

CCI is also calculated for the annual maxima of SWH, $H_{s,max}$ (SSI replaced by $H_{s,max}$ in Eq. 2). The $m \pm \sigma$ values of $CCI_{Hs, max, current}$ are 3.83 \pm 1.91 %, 3.85 \pm 1.69 % and 1.57 ± 2.10 %, for the Ionian, North and South Aegean, respectively. These values reveal a general small increase of SWH annual maxima with a minor possible decrease only in the South Aegean for the current period (2001–2050). The respective $m \pm \sigma$ values of $CCI_{Hs,max, future}$ are 2.06 \pm 2.49 %, 0.45 ± 2.04 % and 0.21 ± 3.27 %; thus, a general attenuation of spatially averaged $H_{s,max}$ is expected in the AIS during the second half of the twenty-first century compared to the current period. This is in accordance to the deductions of Lionello et al. ([2008](#page-33-0), [2012\)](#page-33-0), Benetazzo et al. ([2012](#page-32-0)), Casas-Prat and Sierra [\(2013\)](#page-33-0). Note that CCI concerning $T_{-10, max}$ (annual maximum T_{-10}) is also under a decreasing trend throughout the twenty-first century in comparison to the reference period, but changes are smaller than the ones of H_s fields. They are practically negligible specifically in the Aegean Sea, which is generally reasonable, since fetch-limited seas prevail there. Further analysis of mean and extreme wave directionality

should shed more light about the magnitudes of extreme wave lengths and periods in future studies.

All the above signify a clear pattern of marine (and consequently atmospheric) climate change signals in the AIS during the twenty-first century, which is characterized by a general attenuation trend of the storm severity and a consequent generic debilitation of severe marine events towards the end of the twenty-first century. The most probable cause for that is the weakening of winds and cyclonic activity over the Mediterranean towards 2100 (Marcos et al. [2011\)](#page-34-0), and the consequent negative future trend of the mean storm-induced SLH (Jordà et al. [2012\)](#page-33-0). Thus, we have also deduced that single severe events could be of increased strength, yet they would more infrequent (Marcos et al. [2011\)](#page-34-0). Seasonality of extreme marine events (e.g. reduction of winter SLH_{max}) could be linked to the number and intensity of cyclones reported by Jordà et al. [\(2012\)](#page-33-0); i.e. the positive trend of the NAO index especially in winter and the poleward shift of storm tracks, could be the main reasons for the projected higher SLP values specifically in the AIS (Šepić et al. [2012](#page-34-0)). This is consistent with the decrease of extreme SLH towards 2100 found in the present study. Moreover surges are mainly induced by winds in coastal areas of wide and shallow continental shelfs, but that is hardly the case in the AIS. SLPs are better represented in our analysis compared to winds; therefore, the presented estimations of storm surge events should be adequately reliable. Ultimate scope of the study is to avoid overestimations of flood risks along Greek coastal areas in the future. Winddriven waves are found to probably follow a decreasing trend in the AIS (east-central Mediterranean) during the twenty-first century attending the general pattern of milder marine storm extremes in the future period than the reference one (also derived by Lionello et al. [2008](#page-33-0)), with minor exceptions during summertime in most of the study areas (also found by Benetazzo et al. [2012](#page-32-0)).

5 Conclusions

In this paper changes in the wind, SLP, wave and storm surge characteristics of the Aegean and Ionian Seas (AIS) under the SRES-A1B emission scenario are investigated for the first and the second half of the twenty-first century in comparison with a reference period (1951–2000).

The analysis of simulated wind patterns over Greece shows that the (mainly north and northeastern) wind direction is estimated to remain invariant throughout the twenty-first century in the Aegean Sea. This means that the prevailing synoptic systems over the Balkan Peninsula and eastern Mediterranean, which mainly form and affect wind directions, are expected to remain generally stable as far as their centre locations are concerned. The estimated reinforcement of the Etesian winds during the summer period in the future is attributed to the deepening of the Asian thermal low and the West Africa heat low.

The assessment of climate change (based on SRES-A1B) effects on the sea-surface dynamics of the AIS until the end of the twenty-first century entails two main signals for the simulated mean wave fields (based on H_s), while a distinct signal of general attenuation is estimated for the storm surges. Specifically, the mean SWH fields in the AIS are estimated to follow the general storminess attenuation from the reference to the future period. The same pattern applies to the annual maxima SWH fields of the Ionian, Libyan and Levantine Seas, while a persistent increase of yearly peaks is expected in the central and northern Aegean Sea. The southern Aegean Sea is mildly affected by these changes due to the limited flow through the two Cretan straits. The second signal is associated with the increase of Etesian winds, which are expected to significantly affect the central, south and southeastern Aegean wave climate, especially during summer and autumn. In contrast with the general trend, increased wave energy is observed during the low-energy season, particularly to those regions of the Aegean with large northerly fetches, i.e. north of Cyclades island group and Crete. In accordance to the findings of Conte and Lionello [\(2013](#page-33-0)), the storm surge simulations also show a clear attenuation of storminess and inter-annual surge maxima for the AIS, especially during the future period. Magnitudes of annual surge maxima are expected to increase by 30–40 % in the North Aegean during the current period, while their frequency of occurrence is estimated to decline. The attenuation signal is also related to the generally decreasing spatiotemporal trends of storm surges under SRES-A1B scenario. Storm surges are estimated to intensify in the North Aegean Sea, especially in the first half of the twenty-first century, unlike the South Aegean Sea where they will probably debilitate. Nevertheless, storm surges in the coastal zones of northern Greece are expected to remain stably larger than in the southern parts of the country in the twenty-first century, rendering the North Aegean low-land coastal areas more prone to flooding than others in the AIS. The general attenuation patterns are due to changes in the seasonal variability of atmospheric patterns and barometric centres. An estimated expansion of the annual cycle of storm surges towards the warmer period of the year is shown throughout the entire domain, consistent with Jordà et al. ([2012](#page-33-0)).

The analysis of extreme wave heights in the North Aegean Sea reveals a significant increase in their severity during the current period, as well as a pronounced increase in prediction uncertainty during the future period, especially for high return periods (compared to the reference period). In the South Aegean, there are no evident climate change effects on extreme wave heights. In the Ionian Sea, extreme wave heights are expected to increase during the current period, while return level estimates close to those of the reference period are estimated for the future period. Extreme storm surges are also

estimated to increase in the North and South Aegean Sea (current period), while return level values close to those of the reference period have been estimated for the future period. In the Ionian Sea, there is a relative stability in the MLEs of extreme storm surges for the reference and the current period, while a significant increase in prediction uncertainty is evident in the latter. During the second half of the twenty-first century storm surge extremes are estimated to be lower than those of the reference period. The findings for the SLP changes during winter show an increase of surface pressure for both the current and the future period, while even though wind speeds are generally estimated to increase in the AIS during the current period, they may decrease in the last 50 years of the twentyfirst century. Thus, it seems that the extreme storm surges are mainly affected by the changes in wind speeds rather than changes in the synoptic conditions over the domain of study. In general, there is an indication of a seasonal time shift from winter to spring in the occurrence of the most extreme storm surges in the AIS between the reference and current period.

All things considered, our results imply a specific mechanism of regional climate change, i.e. we identify an expected self-regulating behaviour of the marine and atmospheric climate in the Mediterranean region and specifically in the AIS. We estimate a projected intensification of severe events during the first half of the twenty-first century under the SRES-A1B scenario and subsequent storminess attenuation towards the end of the twenty-first century; this leads to resettlement of milder extreme marine events, but of significantly higher uncertainty. Nonetheless, even though the dynamically downscaled implementation of the specific RCM used provided satisfactory results in comparison to reanalysis data used as evaluation standards, extra attention should always be given to its physical parameterizations, the orography and size of the model domain, the forcing input (emission scenarios, etc.) and the assimilation of large-scale meteorological forcing (Giorgi and Mearns [1991,](#page-33-0) [1999](#page-33-0)). Giorgi and Anyah [\(2012](#page-33-0)) mention that RegCM's hydrostatic nature induces some limitations, when it is applied on very high-resolution domains. Their long-term goal is to provide a fully coupled regional Earth System Model with other components of the climate system aiming on even better simulations of the present climate and furthermore reliable future scenarios.

The literature review for the expected MSL from various scenarios shows relatively small SLR in the Mediterranean due to the steric effect of about 10 cm for the current period and 30 cm for the future period. However, these results strongly depend on the Atlantic dataset used to force the regional models at the boundary with the open ocean (Slangen et al. [2016\)](#page-34-0). Similarly, but at regional scale, results may depend on the Black Sea forcing of the Aegean Sea. The mass addition will contribute a supplementary and approximately equal amount to the SLR (i.e. of about 10 cm for the current and 30 cm for the future period), provided that the recently measured trends remain the same until the end of the twenty-first century.

Future research should focus on the estimation of climate change impacts on coastal vulnerability of the AIS taking into account the combined effects of extreme waves and storm surges, superimposed on the projected MSL rise. This kind of assessment is crucial for twenty-first century coastal policies in the AIS, regarding the design levels of protection measures.

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