

Increased threat of tropical cyclones and coastal flooding to New York City during the anthropogenic era

Andra J. Reed^{a,1}, Michael E. Mann^{a,b}, Kerry A. Emanuel^c, Ning Lin^d, Benjamin P. Horton^{e,f}, Andrew C. Kemp^g, and Jeffrey P. Donnelly^h

^aDepartment of Meteorology, The Pennsylvania State University, University Park, PA 16802; ^bEarth Environmental Systems Institute, The Pennsylvania State University, University Park, PA 16802; ^cDepartment of Earth, Atmospheric, and Planetary Sciences, Program in Atmospheres, Oceans, and Climate, Massachusetts Institute of Technology, Cambridge, MA 02913; ^dDepartment of Civil and Environmental Engineering, Princeton University, Princeton, NJ 08544; ^eDepartment of Marine and Coastal Sciences, Rutgers, The State University of New Jersey, New Brunswick, NJ 08901; ^fEarth Observatory of Singapore and Asian School of the Environment, Nanyang Technological University, Singapore 639798; ^gDepartment of Earth and Ocean Sciences, Tufts University, Medford, MA 02155; and ^hDepartment of Geology and Geophysics, Woods Hole Oceanographic Institution, Woods Hole, MA 02543

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In a changing climate, future inundation of the United States' Atlantic coast will depend on both storm surges during tropical cyclones and the rising relative sea levels on which those surges occur. However, the observational record of tropical cyclones in the North Atlantic basin is too short (A.D. 1851 to present) to accurately assess long-term trends in storm activity. To overcome this limitation, we use proxy sea level records, and downscale three CMIP5 models to generate large synthetic tropical cyclone data sets for the North Atlantic basin; driving climate conditions span from A.D. 850 to A.D. 2005. We compare pre-anthropogenic era (A.D. 850–1800) and anthropogenic era (A.D. 1970–2005) storm surge model results for New York City, exposing links between increased rates of sea level rise and storm flood heights. We find that mean flood heights increased by ~1.24 m (due mainly to sea level rise) from ~A.D. 850 to the anthropogenic era, a result that is significant at the 99% confidence level. Additionally, changes in tropical cyclone characteristics have led to increases in the extremes of the types of storms that create the largest storm surges for New York City. As a result, flood risk has greatly increased for the region; for example, the 500-y return period for a ~2.25-m flood height during the pre-anthropogenic era has decreased to ~24.4 y in the anthropogenic era. Our results indicate the impacts of climate change on coastal inundation, and call for advanced risk management strategies.

tropical cyclones | flood height | storm surge | relative sea level | New Jersey

Tropical cyclones (TCs) and their associated storm surges are the costliest natural hazards to impact the U.S. Atlantic coast (1–3). For example, Hurricane Sandy caused an estimated \$50 billion of damage and destroyed at least 650,000 houses in 2012, largely because of flooding from a 3- to 4-m storm surge and large waves (4). A storm surge is the anomalous rise of water above predicted astronomical tides, and its height is driven primarily by wind patterns, storm track, and coastal geomorphology forcing water onshore, with a smaller contribution from reduced atmospheric pressure allowing the ocean surface to rise. The financial cost and human impact of future storm surges will be controlled by the TC climate (frequency, intensity, size, duration, and location) and the rate of relative sea level rise (RSLR), which is the base water level upon which storm surges occur (5, 6). The flood height attained during a given storm is determined by combining storm surge, tides, and relative sea level. Therefore, as sea level rises through time, coastal inundation risk from storm surges rises as well. Thus, it is useful to conduct a long-term analysis of the impact of changing TC climates and RSLR on flood heights (7).

The observational record of TCs in the North Atlantic Ocean basin spans A.D. 1851 to the present, but is too short (8) and

potentially unreliable (9) to accurately assess long-term trends in TC frequency, intensity, and storm surge height, particularly for the largest events and for locations that rarely experience land-falling TCs (e.g., refs. 8–13). As an alternative to the observational record of TCs in the North Atlantic Ocean basin, ref. 8 developed a long-term synthetic TC data set, downscaled from the National Center for Atmospheric Research Climate System Model version 1.4 spanning the past millennium, which allows for more accurate assessment of low-frequency variability in TC activity over long periods of time. This process creates a long-term synthetic TC data set consistent with a reasonable past climate (8, 13), and is described in detail in refs. 14 and 15. Here we generate long-term synthetic TC data sets downscaled from the newer, state-of-the-art Coupled Model Intercomparison Project Phase 5 (CMIP5) models. To perform our analysis, we use an interdisciplinary approach that combines TCs with simulated storm surges and proxy relative sea level reconstructions of the last two millennia from southern New Jersey (Fig. 1) (16).

We examine changes in coastal flooding in New York City (NYC) using two time periods to provide a paleoclimate perspective of coastal flooding events such as Hurricane Sandy. We define the anthropogenic era to be a time period in which anthropogenic forcing can be assumed to be dominant (A.D. 1970–2005); we choose the pre-anthropogenic era to be a time period in which anthropogenic forcing can be assumed to be minimal (A.D. 850–1800). Our definition of the end of the time period for the pre-anthropogenic era is consistent with several previous studies (17–19).

Significance

We combine proxy sea level records, downscaled tropical cyclone data sets, and storm surge models to investigate the impacts of rising sea levels and tropical cyclones on coastal inundation in New York City. The flood risk for New York City due to tropical cyclones and their resultant storm surges has increased significantly during the last millennium. Mean flood heights increased by >1.2 m from ~A.D. 850 to A.D. 2005 due to rising relative sea levels. Additionally, there were increases in the types of tropical cyclones that produce the greatest surges for the region. Subsequently, the 500-y flood height return periods have fallen to ~24.4 y throughout the millennium.

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¹To whom correspondence should be addressed. Email: axr5145@psu.edu.

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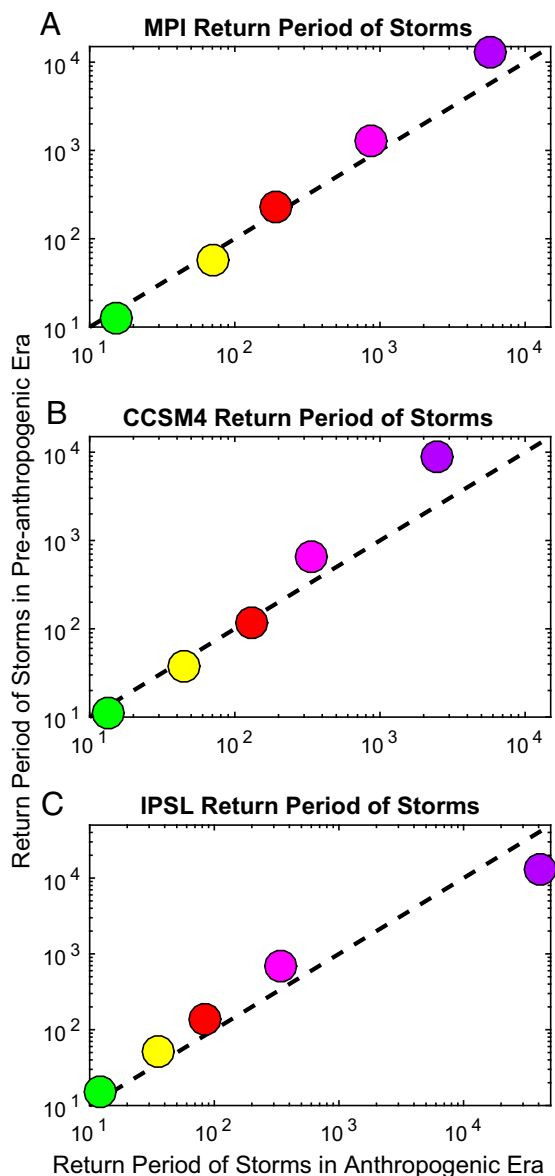


Fig. 6. Comparison of the return periods of storms for the NYC region, by category, in the pre-anthropogenic era (A.D. 850–1800) to the return periods of storms, by category, in the anthropogenic era for (A) the MPI model, (B) the CCSM4 model, and (C) the IPSL model. Categories are according to the Saffir–Simpson scale: Category 1 (green), winds 64–82 kts, or 74–95 mph; Category 2 (yellow), winds 83–95 kts, or 96–110 mph; Category 3 (red), winds 96–112 kts, or 111–129 mph; Category 4 (magenta), winds 113–136 kts, or 130–156 mph; Category 5 (purple), winds 137 kts or higher, or 157 mph or higher.

and storm surge models to investigate the impacts of RSLR and TC characteristics on flood heights for NYC. Our results indicate that, compared with the pre-anthropogenic era, flood heights have increased during the anthropogenic era not only due to RSLR but also due to changes in TC characteristics, leading to an increased risk of coastal inundation for NYC. These results indicate the impacts of climate change on coastal inundation, and the necessity for risk management solutions in this highly populated region.

When combining RSLR from our proxy sea level record with storm surges generated by storm surge models for our synthetic TCs, we see that flood heights at The Battery in NYC are significantly greater during the anthropogenic era than during the

pre-anthropogenic era. We find greatly decreased return periods of flood heights across all three of our models when comparing the two time periods. The means of the anthropogenic flood height distributions are statistically greater than the means of the pre-anthropogenic flood height distributions by ~ 1.24 m at the 99% confidence level, due to RSLR. Additionally, we find an increased risk of higher surges during the anthropogenic era than during the pre-anthropogenic era for NYC even if RSLR is not considered. Although the means of the pre-anthropogenic and anthropogenic distributions of storm surge heights are not statistically different from one another when RSLR is neglected, the storm surge heights in the tails of the anthropogenic distributions are significantly greater than storm surge heights in the tails of the pre-anthropogenic storm surge distributions.

Our study indicates that during the anthropogenic era, there are increases in the extremes of the types of storms that explain the majority of storm surge for NYC. First, when comparing our two time periods, there is an increase in storm RMW during the anthropogenic era. Although storms with large RMWs may not be particularly intense, they may produce winds capable of creating a storm surge at The Battery for extended periods of time. Additionally, we see more-intense storms with a greater ability to produce high storm surges at The Battery in NYC during the anthropogenic era than during the pre-anthropogenic era.

Methods

Proxy Relative Sea Level Records. We use an existing relative sea level reconstruction from southern New Jersey (16) to describe the long-term baseline on which the simulated storm surges occur. The reconstruction was produced using foraminifera and bulk sediment $\delta^{13}\text{C}$ values measured in cores of dated salt marsh sediment from two sites located ~ 58 km apart (Cape May Courthouse and Leeds Point; Fig. 2). The Cape May Courthouse record spans the period since \sim A.D. 700, and the Leeds Point record spans the period from \sim 500 B.C. to \sim A.D. 1600. Each reconstruction has a 2σ age uncertainty and a 1σ vertical uncertainty. The two reconstructions were combined to produce a single, regional relative sea level record, which is what an observer at the coast would have experienced, and is the net outcome of multiple and simultaneous processes including GIA. A caveat of using this data set is that relative sea level differences between southern New Jersey and NYC may arise over decades to centuries because of spatial differences in the rate of GIA (35), the fingerprint of ice sheet melt (36), and the role of ocean currents, including the strength and position of the Gulf Stream (24, 37).

Relative sea level reconstructions produced from salt marsh sediment do not preserve the seasonal to interannual variability that is evident in tide gauge time series because biological sea level indicators such as foraminifera and plants respond to longer-lived trends and because the slices of sediment used in the reconstruction have a thickness (typically 1 cm) making them time-averaged. Therefore, the proxy reconstruction records multidecadal to centennial-scale relative sea level trends. Seasonal and interannual sea level fluctuations caused by temporary weather patterns (winds and pressure), coastal sea surface temperatures and salinities, and ocean currents can produce fluctuations of up to ~ 0.3 m in addition to this trend, as evidenced by the size of annual average relative sea level departures from the overall trend measured at The Battery tide gauge in NYC.

Synthetic Tropical Cyclone Data Sets. We apply the downscaling method developed in refs. 8, 14, and 15 to the MPI, CCSM4, and IPSL CMIP5 models. The downscaling method used by ref. 8 uses monthly mean thermodynamic state variables, including sea surface temperature and vertical profiles of temperature and humidity, as well as daily mean values of interpolated 250-hPa and 850-hPa winds to generate TCs and model their tracks and intensity (8, 14, 15). When modeling the intensity of downscaled TCs, RMW values are also calculated deterministically by the Coupled Hurricane Intensity Prediction System model (15, 38, 39). Our choice of models is dictated by the availability of the necessary thermodynamic and kinematic state variables from A.D. 850–2005, although, for this time period, only the MPI model provides the daily wind fields required for our analysis. In the interest of considering results from more than one model, we use the less desirable monthly values of the wind fields from the CCSM4 and IPSL models, in these cases fixing variances and covariances of winds at the arbitrarily chosen A.D. 1980 values, but allowing the winds to vary over the seasonal cycle (13).

A simple analysis revealed that long-term variations are well-represented by the fixed covariance simulation (e.g., figure 1 in ref. 13).

We require large numbers of TCs to perform a reliable statistical analysis of storm surge heights. Thus, we use a filter to select about 10,000 storms, for each model, that pass within 250 km of The Battery (Fig. 2). Of these storms, ~5,000 were generated in each the pre-anthropogenic and anthropogenic periods. The overall event frequency is calculated from the ratio of the number of TC events simulated to the total number seeded. This ratio is multiplied by a universal calibration constant for each model, derived so as to produce the observed frequency of TCs during the late 20th century (15).

Data used for this project are publicly available from the Earth System Grid Federation website, pcmdi9.lln.gov/esgf-web-fe/. Researchers interested in downscaled fields may contact coauthor K.A.E. via email with their request.

Storm Surge Modeling. We apply the Advanced Circulation (ADCIRC) model (40) to simulate the storm surges induced by all synthetic storms. ADCIRC is a finite-element hydrodynamic model that has been validated and applied to simulate storm surges and make forecasts for various coastal regions (e.g., refs. 41–44). It uses an unstructured grid with very fine resolution near the coast and much coarser resolution in the deep ocean. The numerical grid we use for this New York/New Jersey region study was created by ref. 20; the grid has a resolution of ~100 m along the NYC

coast and was shown to generate results similar to those from a higher-resolution (~10 m) grid (20).

The ADCIRC storm surge modeling is driven by the storm surface wind and pressure fields. Given the characteristics (maximum wind speed, minimum central pressure, and RMW) of the synthetic storms, we estimate the surface wind and pressure fields along the storm track using parametric methods, similar to ref. 20. In particular, the surface wind is estimated by fitting the wind velocity at the gradient height to an analytical hurricane wind profile (45), translating the gradient wind to the surface level with a velocity reduction factor (0.85) and an empirical formula for inflow angles (46), and adding a fraction (0.55 at 20 degrees cyclonically) of the storm translation velocity to account for the asymmetry of the wind field induced by the surface background wind (47). The surface pressure is also estimated from a simple parametric model (48).

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