



GIS analysis of effects of future Baltic sea level rise on the island of Gotland, Sweden

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Abstract. Future sea level rise as a consequence of global warming will affect the world's coastal regions. Even though the pace of sea level rise is not clear, the consequences will be severe and global. Commonly the effects of future sea level rise are investigated for relatively vulnerable development countries; however, a whole range of varying regions needs to be considered in order to improve the understanding of global consequences. In this paper we investigate consequences of future sea level rise along the coast of the Baltic Sea island of Gotland, Sweden, with the aim to fill knowledge gaps regarding comparatively well-suited areas in developed countries. We study both the quantity of the loss of features of infrastructure, cultural, and natural value in the case of a 2 m sea level rise of the Baltic Sea and the effects of climate change on seawater intrusion in coastal aquifers, which indirectly cause saltwater intrusion in wells. We conduct a multi-criteria risk analysis by using lidar data on land elevation and GIS-vulnerability mapping, which gives the application of distance and elevation parameters formerly unimaginable precision. We find that in case of a 2 m sea level rise, 3 % of the land area of Gotland, corresponding to 99 km², will be inundated. The features most strongly affected are items of touristic or nature value, including camping places, shore meadows, sea stack areas, and endangered plants and species habitats. In total, 231 out of 7354 wells will be directly inundated, and the number of wells in the high-risk zone for saltwater intrusion in wells will increase considerably. Some valuable features will be irreversibly lost due to, for example, inundation of sea stacks and the passing of tipping points for seawater intrusion into coastal aquifers; others might simply be moved further inland, but this requires considerable economic means and pri-

oritization. With nature tourism being one of the main income sources of Gotland, monitoring and planning are required to meet the changes. Seeing Gotland in a global perspective, this island shows that holistic multi-feature studies of future consequences of sea level rise are required to identify overall consequences for individual regions.

1 Introduction

Sea level rise is currently a fact, as stated by the IPCC (2014; references therein), being a result of, for example, the observed slow but ongoing and irreversible collapse of the West Antarctic Ice Sheet (WAIST) and the melt of the Greenland ice sheet (e.g. Hanna et al., 2005; Meier et al., 2007; Stroeve et al., 2007). The pace of sea level rise is increasing; according to IPCC (2014), a global mean sea level rise of 0.63 m is *likely* to occur until the year 2100, with *virtually certain* continued sea level rise after this point (IPCC, 2014); on a millennium scale, the near-complete loss of the Greenland Ice Sheet will with high confidence cause a mean sea level rise of 7 m (IPCC, 2014). The exact pace and amount of future sea level rise are consequently highly uncertain (Nicholls et al., 2011). In any case, projected future sea level rise will inundate areas along the world's coasts, where we find most of our settlements and infrastructure (e.g. Small and Nicholls, 2003; Neuman et al., 2015). We will need to adapt. A first step in the process of adaptation is to investigate the consequences of sea level rise, reversible and irreversible, on nature, humans, and society, including infrastructure. We present here results for a future sea level rise of 2 m, beyond

the predictions until 2100 but still clearly below the highest possible sea level rise.

One frequent and arguably severe effect of sea level rise on coastal regions would be seawater intrusion into coastal aquifer systems. For the Baltic Sea and elsewhere, most studies have primarily been concerned with effects on climate change on river discharge (Andréasson et al., 2004; Graham, 2004; Chalov et al., 2015). Fewer have addressed groundwater resources; Sherif and Singh (1999) present one of the first studies on the effects of climate change on seawater intrusion in two coastal aquifers. Even relatively modest increases in average sea level will change the position of the toe of the freshwater–saltwater interface of coastal aquifers relatively far in the inland direction. More generally, observations show that the thickness and volume of coastal freshwater reservoirs of the Baltic Sea can reduce considerably under changing environmental conditions (Rasmussen et al., 2013).

In addition to such effects on water quality and water supply, climate-driven sea level rise is expected to have various effects on agricultural, industrial, and service sectors. Flooded industrial and agricultural land may be associated with significant production losses. This land may potentially also release contaminants and nutrient from the soil surface. The inherent complexity of natural and social systems makes it a research challenge to more comprehensively understand and address the impacts of climate change on the basis of social relevance, systemic risks, and options for action. In this context it is important to build a knowledge base that allows consideration of various conflicting perspectives when dealing partly emotive issues (Raymond et al., 2010). Climate adaptation involves the management of shared natural resources, where the different possible priorities and conditions make sustainable management relatively complex. In particular, the system risks, unlike traditional risks, need attention. Systemic risks are characterized by a high degree of complexity and uncertainty and are usually not limited to a single sector, which requires more holistic, reflective, and adaptive strategies (Renn et al., 2011).

To allow for system analysis on the necessary overall level, we will here process spatially distributed data and, through GIS, synthesize and visualize areas that are at high risk of suffering from the effects (basic methodology e.g. according to Persson et al., 2011). Risks related to climatology, geomorphology, hydrology, natural resources, ecology, and environmental assessment can then be explicitly considered. We acknowledge that several studies have considered the impact of sea level rise on a variety of environmental and anthropogenic features (Kont et al., 2003; Blankespoor et al., 2014), yet often they fail to take on the multi-consequential characteristic of this subject. Often the effects of future sea level rise are investigated for development countries (Dasgupta et al., 2009; Dwarakish et al., 2009). A whole range of varying regions, including both developing and developed countries, need to be considered in order to improve the understanding of global consequences. In this paper, we use the

case study of the Baltic Sea island of Gotland, Sweden, as an example for a well-suited area in a non-developed country, where means may be stronger to prepare for future sea level rise but at the same time historical investments in infrastructure, industries, and private properties may be considerable. Gotland has a fully intact and self-maintaining infrastructure; it can only be reached by boat and is therefore its own entity.

We here investigate the effects of future sea level rise on a multitude of features combined, thereby providing a basis for assessments on overall impacts on the environment and infrastructure of the island. We base the investigation on GIS-vulnerability mapping as a variant of the coastal vulnerability index (CVI) (Gornitz, 1990; Dwarakish et al., 2009), addressing the following main issues:

1. quantitative assessment of certain consequences of future 2 m sea level rise around Gotland on features of infrastructure, cultural, and environmental value;
2. establishment of the pattern of effects on groundwater hydrology and wells;
3. establishment of the risk of well salinization at the current (2015) sea level and at a 2 m sea level rise.

We note that Gotland, according to the standards of EU's Water Framework Directive, already shares the characteristics of having unsatisfactory (ground)water status with other coastal regions of the Baltic Sea, including the nearby Stockholm region in Sweden (Andersson et al., 2012, 2014). We use an extensive dataset to underpin our calculations and interpretations, including data from well measurements, elevation data, meteorological data, data on infrastructure, land cover and land use, and data on cultural objects. In other words, these data are used to investigate possible economic losses, changed quality of life (e.g. from water quality deterioration), and loss of features of cultural value of land inundation due to sea level rise. Also, if we see Gotland as a "miniature world", what effects can we expect from sea level rise globally?

2 Gotland – study area description

Located in the Baltic Sea about 80 km east of Sweden, Gotland is the country's largest island (Fig. 1) with an area of 3140 km² and a permanent population of just under 60 000 people (Region Gotland, 2014). Climate here is temperate and characterized by its coastal position with a range of average temperature from -2.5°C in February to 16°C in July. Precipitation averages 500 to 700 mm yr⁻¹ in the coastal and inner regions respectively. This island setting, in combination with the distinguishable Silurian limestone bedrock, creates key habitats for both flora and fauna that are unique to this region. More than 8 % of the island is under official nature protection. Accordingly, cultural landscapes and

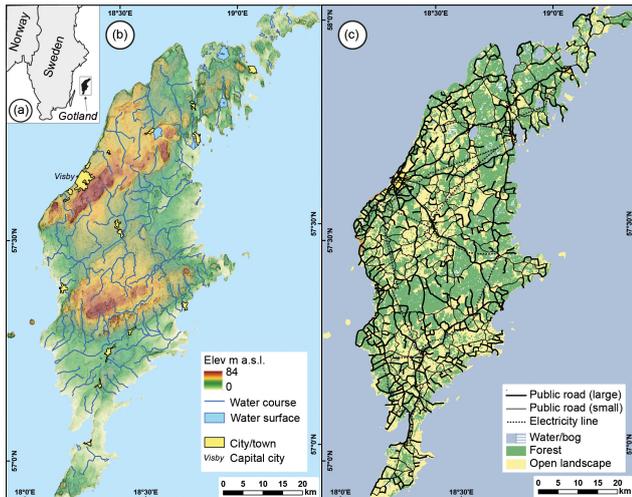


Figure 1. Study area: (a) location in Scandinavia; (b) topography, hydrology, and major settlements; (c) road network and land cover.

heritage on the island are rich in hundreds of stone ships (oldest dating 1000 BC) and rune stones (oldest dating year 400), 92 medieval churches, and extensive historical pasture- and farmland (Region Gotland, 2014).

Tourism is therefore an important factor in commercial life on the island. Almost 100 000 international tourists visited the island in 2014 (Region Gotland, 2014). Other important business areas are lime and cement mining, agriculture, and food industry; more than 10 % of the sheep and lambs in Sweden are found on this island, for example. Administratively Gotland constitutes both a county and a municipality of its own, with a gross regional product per capita of 308 000 SEK in 2013 which corresponds to 78 % of the national average. Infrastructure on the island is well established: the public transport network, for example, covers most of the island and frequent ferry and airplane departures connect it to the mainland. In 2013 40 % of the electricity supply came from wind power stations on the island, 50 % of the rural population had access to fiber broadband, and the municipal water supply system was of good quality. There are issues of pollution, mainly from poor individual sewage systems, in many of the separate water catchments, however (Region Gotland, 2014).

Gotland was covered by Fennoscandian ice sheets during the Quaternary (Kleman et al., 1997) and is still uplifted in glacio-isostatic adjustment, $\sim 1.5 \text{ mm yr}^{-1}$ in its northern parts and ca. 0.5 mm/year in its southern parts (Ågren and Svensson, 2011), which is insufficient to amend the consequences of predicted sea level rise.

The topography of Gotland is shaped by the Silurian cover rock layers, dipping slightly towards the east, and with a clear SW–NE structure forming the two highest ridges in the island's interior (Fig. 1b). The lowest and thereby most vulner-

able parts of the coastline are consequently along the east coast and with increasing distance to the ridges.

3 Data and methods

Analyses for this study were conducted in an ArcGIS environment using a broad range of data sources: (i) LiDAR elevation data with 2 m resolution over the 3140 km² study area from the Swedish National Land Survey; (ii) GIS-based data from the county administrative board of Gotland including various infrastructure (such as roads, buildings, wind power stations, power lines, camping sites), land cover and land use data (farming land, wetlands, forests, conservation areas, shore meadows, bird nesting areas, endangered plant species habitats) and features of cultural value (churches, historical wind mills, ancient monuments); (iii) well data from 7534 wells including location coordinates, elevation, well depth, groundwater level, and salinity, as well as soil types (vector) from the Swedish Geological Survey (SGU); and (iv) a map of annual average precipitation from the Swedish Meteorological and Hydrological Institute (SMHI). Notably, the lidar-based 2 m resolution elevation model of Sweden gives a formerly unimaginable precision in the application of distance and elevation parameters with a standard error in elevation of 0.05 m and a standard error on plain of 0.25 m on average (Lantmäteriet, 2015). The Swedish raster model is delivered in ASCII format. This 2 m ground elevation model is based on airborne laser scanning of the terrain, with a point density of approximately 0.5–1 points per m². The ground surface was produced through automatic classification of points in the point cloud, with known elements (such as water polygons and buildings) used as supportive elements to remove buildings and vegetation (Lantmäteriet, 2015).

3.1 Quantitative assessment of inundated areas

For quantifying the proportion of affected and lost assets, a successive overlay analysis was applied combining the digital elevation model (DEM) with vector layers of infrastructure, cultural objects, and features of environmental value. The overlay layer of the DEM consisted of all pixels $\leq 2 \text{ m a.s.l.}$ of the 2 m elevation model to model a sea level rise of a 2 m worst case scenario until 2100. The vector layers of infrastructure included for example built-up areas, wells, roads, industrial areas and gas stations, as well as natural and cultural heritages such as shore meadows, cultural grazing fields, and rune stones.

3.2 Well density and depth to groundwater

Well density was calculated with the point density function in ArcGIS, with the aim to visualize the areas with accumulation of wells, and thereby areas of accumulation of settlement and infrastructure, on Gotland. Well density thereby represents a proxy for population density. DEM elevation values

were extracted for every well point. The well database contains information about the depth to groundwater at the time of well establishment. With this mosaic of snapshot measurements of groundwater depths for the different available wells, we estimated the depth to groundwater for the entire area through interpolation using inverse distance weighting, whereby random differences in measurement values between individual wells would partly cancel. We then subtracted the estimated depth to groundwater from the land surface topography to derive an estimate of the spatially distributed groundwater elevation.

3.3 Risk of saltwater intrusion into wells

In assessing the risk of groundwater salinization of wells, we use a weighted overlay analysis, with inspiration from the risk value–weighing factor (RV) method (Lindberg et al., 1996; Sazvar, 2010), which is a variant of multi-criteria risk analysis that has been used widely for both groundwater protection and environmental management (e.g. Vias et al., 2005; Hossam et al., 2013) as well as for slope risk analysis (e.g. Tangestani, 2009; Pradhan, 2010; Sharma et al., 2013).

The method is based on risk parameters and weighing factors that are assessed for individual areas. The risk factors $R = 0, 1, 2, 3$ are given with increasing importance of the parameters influence on the salinization risk; the risk factor R is multiplied with the weighing factor V of each parameter to achieve the final weighted risk value (Eq. (1), Table 1).

$$\text{Weighted risk value} = V_1 \cdot R_1 + V_2 \cdot R_2 + V_3 \cdot R_3 + \dots + V_n \cdot R_n = \sum V_i \cdot R_i, \quad (1)$$

where R is the risk value and V is the weighing factor.

Since one of our main aims is to assess sea level rise impacts on saltwater intrusion risks, we give relatively high weight to factors that clearly must increase risks at elevated sea levels, such as the proximity of a groundwater well to the coast. Notably, some inland wells may currently be subject to high risk for intrusion of fossil seawater. However, this risk is essentially unaffected by sea level rise; therefore our set of weighting factors gives relatively low-risk values to such wells. In other words, this approach enables comparison of present results on impacts of sea level rise with other factors that can cause salinization of wells.

The risk values and weighting factors are used in a GIS-overlay of the parameter layers (see input layers in Fig. 5, and visual result of the overlay analysis in Fig. 6). In Sweden, this method has been used previously in areas around Stockholm (Lång et al., 2006) and Gotland (Lange, 2013). The variant used here comprises parameters that express (1) distance to coast, (2) distance to lakes, (3) soil type, (4) yearly average precipitation, and (5) elevation a.s.l. (Table 1). Gotland consists almost entirely of Silurian limestone; in the digital geological data we have available, it consists of one bedrock type polygon only. Therefore we omit for simplicity bedrock type

Table 1. Factors included in the risk analysis for saltwater intrusion.

Factor	Value	Risk value	Weighted risk value
Distance to coast (m)	< 300	2	6
	300–500	1	3
	> 500	0	0
Distance to lakes (m)	< 300	0	0
	300–500	1	2
	> 500	2	4
Soil type	Coarse sediments	2	4
	Fine sediments	1	2
	Bare bedrock	0	0
	No data	No data	No data
Prec yearly average (mm)	< 600	2	2
	600–700	1	1
	> 700	0	0
Elevation a.s.l.	< 5	2	6
	5–10	1	3
	> 10	0	0

as a parameter, since the factor would be constant across Gotland without effect on the outcome of the analysis. We here use values of parameters and weighing factors that were developed for Sweden and Gotland in previous work (Gontier et al., 2003; Lång et al., 2006; Sazvar, 2010; Lange, 2013). For Gotland's current ambient conditions, these parameters and weighing factors (Table 1) were found to produce risk values that agree well with observed chloride contents of existing wells in coastal areas (Lange, 2013). Nevertheless, in the adopted methodological approach, it is unavoidable that there is a component of subjectivity in the assignment of risk values and weighting factors. Therefore, we investigate whether, and to which extent, our results and conclusions would be affected were they based on a different, but still realistic and methodologically reasonable, set of parameters. Specifically, we do this by considering the case that all the factors would be given the same weight, $V = 1$. This implies very different input in terms of $R \cdot V$ for some key terms, such as the distance to the coastline, which originally had $V = 3$. The results obtained based on this alternative parameter set are compared to the original results, checking whether the drawn conclusions remain the same in both cases.

Considering both the original ($R \cdot V$ values according to Table 1) and alternative set of parameters (R according to Table 1, $V = 1$), the GIS analysis was performed for the area of Gotland for current (year 2015) sea level and after a 2 m sea level rise (Fig. 6). For the 2m sea level rise scenario, the area below 2 m a.s.l. was removed from the Gotland DEM. The parameters yearly average precipitation, soil type, and distance to lakes are assumed be the same also for a 2 m sea level rise. The factors distance to coastline and land elevation were recalculated for the 2 m sea level rise scenario. The distance to coast was recalculated for the new coastline; elevation above sea level was recalculated emanating

Table 2. Proportions of various types of infrastructure and features of cultural and environmental value that would be inundated in a 2 m sea level rise scenario. Areas are given in square kilometres (km²) and lengths in kilometres (km).

Parameter	In current data			Inundated			Proportion (%)		
	Area	Length	Number	Area	Length	Number	Area	Length	Number
Gotland	3147.4			98.8			3		
Infrastructure									
Roads ¹		5723.8		131.2			2		
Individual buildings ²			16 570			520			3
Power lines		312.3		3.1			1		
Wells			7354			231			3
Wind power stations ³			146			23			16
Lumber yards			3			2			67
Camping sites			20			7			35
Lighthouses			31			7			23
Cultural features									
Farming land	894.6			7.9			1		
Churches (smaller)			10			1			10
Wind mills			212			3			1.5
Ancient monuments			1140			11			1
Environmental features									
Wetlands	79.1			5.6			7		
Forests	1597.9			22.3			1.5		
Conservation areas	311.0			59.2			19		
Shore meadows ⁴	31.0			18.6			60		
Bird nesting areas	47.6			6.0			13		
Endangered plant species habitat (coastal)	0.24			0.13			53		

¹ Of which several are mid-sections. From visual inspection total loss is about 2 times the inundated length. ² Buildings (residential and others) outside “built-up areas”. ³ Unclear what year these data were updated exactly. There were 170 wind power stations in 2014 according to Region Gotland (2014); all but one of the inundated stations are found along the southern coast. ⁴ 68 % of the shore meadows are bordered landwards by open areas which possibly allow for habitat migration.

from the new elevations a.s.l., with 0 m a.s.l. corresponding to the current 2 m a.s.l. We acknowledge that wave actions (e.g. Gutierrez et al., 2011) could contribute to the here quantified effects being on the low-end side of the actual outcome, since we base our quantifications on a mean sea level, which could be temporarily exceeded e.g. because of waves. Nevertheless, our main focus is on relative change (future situation relative to today’s situation), and we expect that the approach gives robust results in terms of where the risk is higher than elsewhere – although absolute numbers are subject to uncertainty. For instance, wave actions would generally be most inland-effective at the flattest coastal zones, which also would be most affected by the average seawater level rise.

4 Results

4.1 Inundation of land area and infrastructure

The main findings of the overlay analysis are presented in Table 2. The table presents values that experience notable losses according to our calculation. An investigation of gas stations identified two of the existing ones as inundated in the scenario. Some examples are illustrated in Fig. 2.

In total, about 3 % of Gotland’s current land surface, an area of 99 km², will be inundated in the scenario of a 2 m sea level rise. In the relatively flat, southern part of the island, the expected percentage of inundation is twice as high. Generally, between 1 and 3 % of the overall infrastructure will be inundated (roads, power lines, wells, and individual buildings, for example). The features that show a higher proportional loss are understandably those that tend to be concentrated along the coast, such as wind power stations, lumber yards, camping sites, and lighthouses.

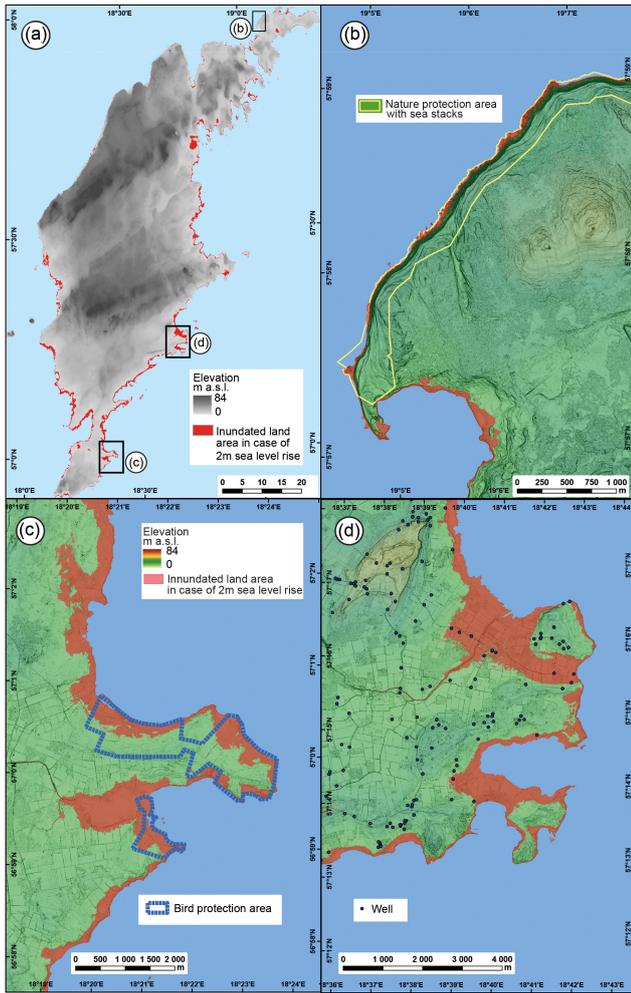


Figure 2. (a) In the case of a 2 m sea level rise, 99 km² of Gotland's total area of 3140 km² will be inundated, corresponding to 3 % of Gotland's land area. (b) Gotland is famous for its nature attractions, e.g. the sea stack area in Digerhuvud's nature reservoir, NW Gotland. (c) Gotland has the richest bird life in northern Europe. A number of bird protection areas, mostly located at the coast, will be inundated. (d) In some areas, the sea will intrude more than 1 km inland in case of a 2 m sea level rise. Except for natural and cultural features, agricultural areas and wells will be affected. In some cases, new islands will be created.

As for cultural features, mostly solitary objects are affected, such as one smaller church and 11 ancient monuments. The characteristic sea stacks will suffer considerable loss (Fig. 2b), which may also be considered of cultural value. Almost the entire sea stack area will be inundated. Walking between sea stacks in Digerhuvud's nature reserve will not be possible anymore (Fig. 2b); wave action will contribute to an increased erosion of the sea stacks (Forsberg, 2001).

For natural reasons, the dominating proportion of the key habitats and nature protection zones are located along the coast; these are indeed vulnerable to rising sea levels and

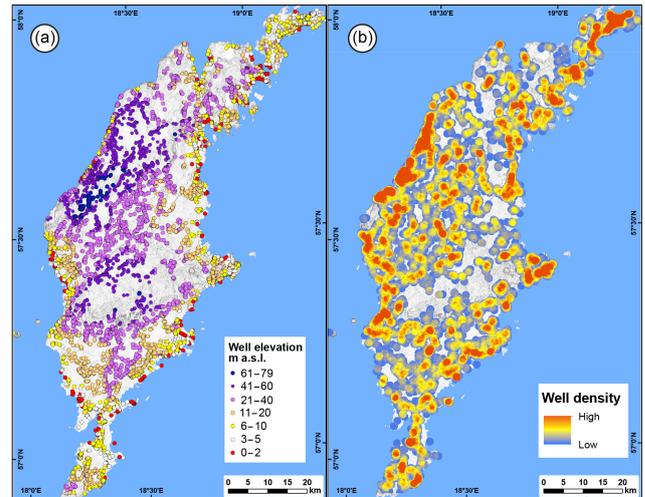


Figure 3. (a) Out of a total of 7354 wells, 231 are located on elevations 0–2 m, corresponding to about 3 % of all wells. These wells will be directly affected by sea level rise through inundation; however, other wells on higher elevations further inland will be indirectly affected by salinization. (b) Well density expressed as point density.

potential losses here reach 10–60 % (e.g. Fig. 2c). With time these habitats may migrate landwards yet. The Gotland shore meadows are unique habitats for birds and endangered species (Olsson, 2008); 60 % of shore meadows (Table 2; Fig. 2a) will be inundated. Landward migration of these is limited by forests and would require human intervention to persist (cf. Olsson, 2008; Cedergren, 2013).

4.2 Well density and depth to groundwater

Figure 3a shows that 231 wells, corresponding to about 3 % of all wells, are located at ground elevations between 0 and 2 m a.s.l. They will hence be directly affected by sea level rise through inundation. Most of these wells, 131 out of 231, belong to summer houses and smaller farms. There were also 30 energy wells, 8 large farm wells, 4 industry wells, 1 irrigation well, and 49 wells with unspecified usage. This reflects the overall spectrum of usage; outside cities and towns, wells are used for summer houses and smaller farms (3837 out of a total of 7354), large farms (297 out of 7354), and irrigation and market gardens (74 out of 7354). There are also a relatively large number of energy wells (1068 out of 7354) and a smaller number of wells with industrial and other usages.

The well density is highest along the coastline and at elevations below 20 m a.s.l. (Fig. 3b), which is consistent with a higher population density near the coast. Except for northwestern Gotland, which contains the largest town (Visby), coastal regions are flat and very close to sea level altitude (Fig. 1b). Hence, despite the fact that groundwater tables are frequently close to ground surface levels in the coastal regions (Fig. 4a), the estimated absolute level of groundwater

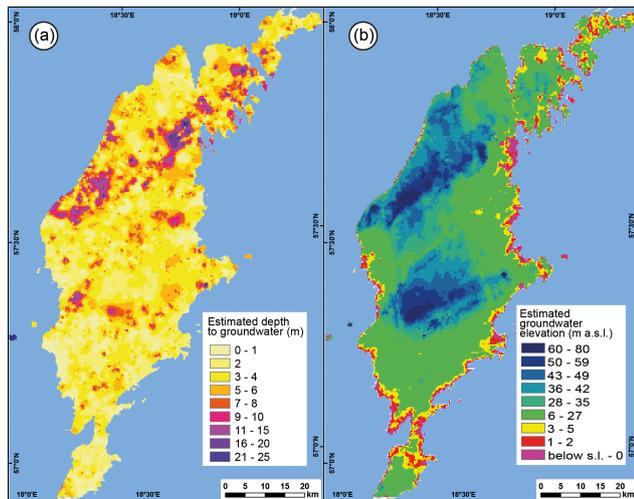


Figure 4. (a) Estimated depth to groundwater. Values for each well were interpolated to one surface. (b) The estimated groundwater elevation across Gotland, calculated by subtracting the estimated depth to groundwater from the topography.

is currently near or at the sea surface level (Fig. 4b). In particular, in the areas shown in purple in Fig. 4b the estimated groundwater elevation is at sea level, which implies very high risk of salinization of wells even without sea level rise.

4.3 Wells and risk of salinization

Figure 5 shows individual contributions of different factors to the risk of well salinization. For each factor, the risk is expressed as a weighted risk value (Eq. 1), where high values reflect elevated saltwater intrusion risk. The risk for density-driven intrusion of relatively heavy saltwater is clearly high (red areas of Fig. 5) at short distances to the coast where saline waters can readily replace fresh groundwater when the fresh groundwater is pumped from the well. Land surface elevation is also an important risk factor, since elevation differences drive groundwater flows from the coast, which can counteract density driven flows of saline water from sea to land. The fact that the annual mean precipitation of Gotland is higher in its central parts than near the coast implies lower local recharge of freshwater close to the coast, which contributes to higher salinization risks. Conversely, proximity to lakes implies higher potential for freshwater replenishment, which decreases the saltwater intrusion risk. The heterogeneous pattern of soil types across Gotland adds patchiness in the weighted overlay analysis. The salinization risk is elevated in coarse sediments (Table 1), which in many cases are located close to the coast. In contrast, lower-risk bare bedrock is frequently located further from the coast.

Figure 6a shows the current spatial variation in final risk of saltwater intrusion, resulting from all contributing factors of Fig. 5. Reinforcing factors related to soil, precipitation, topography, and proximity to seawater make the current salt-

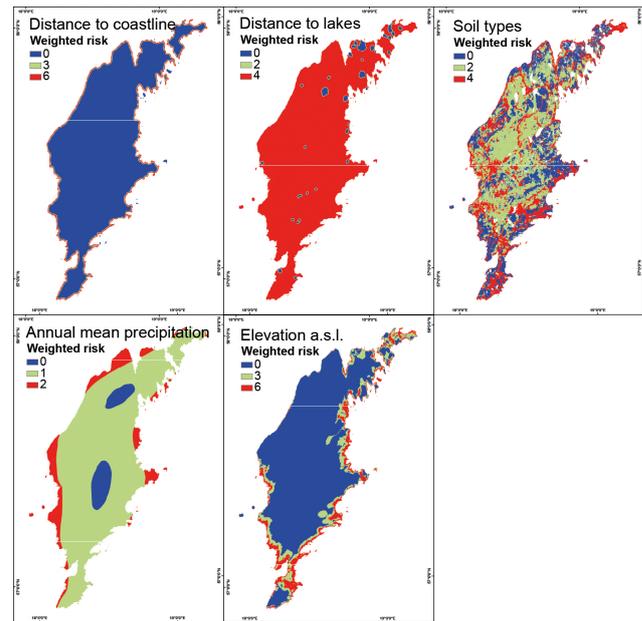


Figure 5. Factors included in the risk analysis for saltwater intrusion (see Table 2 for values and Fig. 6 for visual result).

water intrusion risk considerably higher in a zone that extends up to 5 km from the coastline (yellow to red areas in Fig. 6a). Beyond that zone, risks exhibit a considerable spatial variability (light to dark blue shades of Fig. 6a) but are generally lower albeit non-negligible. These current risks of saltwater intrusion in groundwater wells can be compared to estimated future risks given a projected sea level rise of 2 m shown in Fig. 6b. As previously mentioned, the land area of Fig. 6b is 3 % lower than in Fig. 6a due to inundation from intruding seawater, which for instance is reflected in a wider straight to between Gotland and the smaller island of Fårö in the northwestern corner of Fig. 6. Differences are also pronounced on the southern tip of Gotland; see Fig. 6c (current sea level) and Fig. 6d (2 m sea level rise). In particular, the spit of land in the middle region of the insert maps is considerably narrower in Fig. 6d than in Fig. 6c due to the 2 m sea level rise. However, despite this shrinkage of total land area, the areas that have high risk for saltwater intrusion are projected to increase in the future, which is most pronounced in the south, where for instance the very highest-risk classes (red to orange) extend much further in Fig. 6d than for the current conditions depicted in Fig. 6c.

In total, more than 231 wells of Gotland will be inundated given a 2 m sea level rise (Fig. 7, rightmost bar). Despite the reduced total number of wells in the future compared with today, Fig. 7 shows that the number of wells in the high-risk value classes (18 to 22) will be considerably higher in the future. The most pronounced change is predicted to occur for the highest-risk value class (22), where the number of wells will increase by 250 % from 47 to a total value of 120. The second highest increase is predicted to occur for risk value

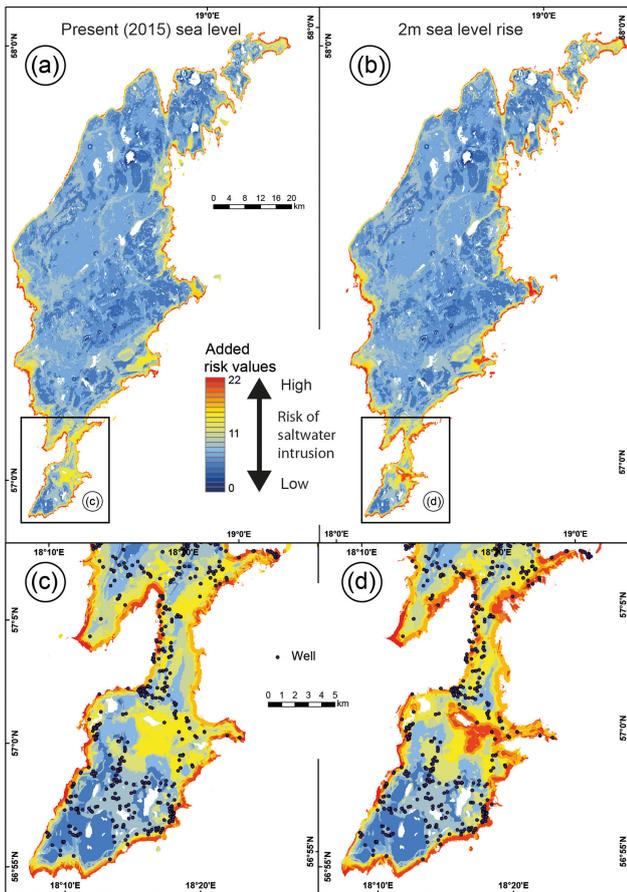


Figure 6. Risk of saltwater intrusion as a result of the addition of weighted risk values according to Table 2 and Fig. 5. (a) Risk of saltwater intrusion in wells with the current (2015) sea level; (b) risk of saltwater intrusion in wells after a 2 m sea level rise (areas below 2 m a.s.l. are subtracted); (c, d) magnification of southern Gotland for both scenarios, including well locations.

class 21, where the number of wells will increase by 150 % in the future, from 402 to a total value of 609. Overall this shows that the percentage of high-risk wells will increase in the future, considering the remaining part of the island.

Investigating the robustness of the above results to the assumed set of risk values and weighting factors (Table 1), we found that results for a relatively different set of parameters (risk value R according to Table 1, weight $V = 1$ in all cases) revealed a very similar pattern (see Supplement), although there are some differences in the absolute values. This is most likely due to the fact that certain regions are subject to high risks because of combined impacts from multiple factors, which means that the results essentially remain the same even in case some of the factors are completely removed from the analysis (or as in the example, by reducing its impact by a factor 3). This means that our main conclusions remain the same in both cases and hence appear to be robust.

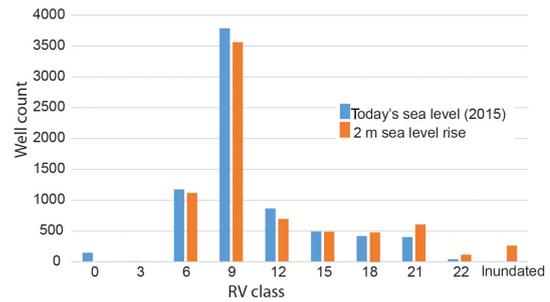


Figure 7. Risk value classes of wells on Gotland for today's (2015) sea level and after 2 m sea level rise. The number of wells in higher-risk classes will increase. Wells below 2 m above the current sea level will be inundated.

5 Discussion

5.1 Multi-criteria risk analysis

Multi-criteria risk analysis with help of GIS-vulnerability mapping to identify risk areas of different types has been used in numerous studies (e.g. Vias et al., 2005; Tangestani, 2009; Pradhan, 2010; Hossam et al., 2013; Sharma et al., 2013). The advantages of this type of analysis is that parameters used can be adapted to the characteristics of both the study area in question and the type of studied risk. However, studies that rely on elevation models for mapping inundation from sea level rise have frequently had too coarse vertical accuracy to support local decision making (Williams, 2013). The on-going development of high-resolution lidar datasets, including the presently used one for Gotland, contributes to the removal this constraint from an increasing number of coastal regions of the world.

In the present study, we used overlay analysis to quantify direct losses by climate-driven rise in average sea level due to land inundation, considering available layers related to features of infrastructural, cultural, and natural value. Recognizing that increased average sea levels are associated with inland advancement of today's freshwater–seawater transition zones, we use weighted overlay analysis with inspiration from the RV analysis to identify future risk areas of saltwater intrusion in wells. Notably, we here aimed at quantifying direct effects of mean sea level rise and land inundation, providing a basis for understanding their contribution and significance relative to secondary effects of sea level rise and other effects of hydro-climatic change on coastal regions. The latter effects include, for instance, increased coastal erosion that might be expected as a consequence of future sea level rise and that might account for additional land loss (Sales, 2009), effects of changes in sea level extremes relative to mean level (Williams, 2013), and effects of changes in patterns of precipitation and evapotranspiration on surface water levels and groundwater recharge (Luoma and Okkonen, 2014). Hence, in the context of overall impacts from multiple processes in

coastal regions, results of inundation-focussed studies such as ours should be seen as relatively robust estimates of minimum effects, which may be exceeded due to the influence of parallel processes and secondary effects (e.g. Torresan et al., 2012).

5.2 Sea level rise – effect pattern on Gotland

For any region affected, sea level rise will create changes in environmental conditions, with consequences people's quality of life. We find for the island of Gotland that, as globally (Neumann et al., 2015), the density of settlements and infrastructure is considerably higher towards the coast. We show that this is reflected in an increasing density of wells near the coastal stretch (Fig. 3). In the case of Gotland, the most endangered features are touristically interesting. More than 50 % of the wells in the risk zone of direct inundation by a 2m sea level rise belong to summer houses and small farms. Additionally, more than 50 % of the area of nature protection areas such as sea stacks, shore meadows, and habitats for endangered plants species that are naturally at the coast are threatened by direct inundation (Fig. 2). Even the minimum predicted sea level rise will consume 60 % of Gotland's protected shore meadows, a breeding place for a large variety of bird species. With the shore meadows, sea stack areas, and bird life diminishing, not only will unique features of natural and cultural value, providing live quality for humans, animals, and plants, diminish but, as a consequence, tourism will also decrease.

This is a pattern known from other Baltic Sea states, for example Estonia (Kont et al., 2003). Tourism and nature protection areas are main attractions and a major income of the economy of Gotland so these losses will need to be addressed in future planning. This basic problem is, for instance, also seen in the Caribbean islands, where main touristic attractions are located in coastal regions that have been subject to considerable developments, but which are vulnerable to sea level rise and extreme weather events (Lewsey et al., 2004).

An indirect effect of inundation by a higher sea level will be the inland migration of areas with the risk of saltwater intrusion in wells. Naturally the risk is highest along the coastline, with distance to sea shore and elevation above sea level providing two main parameters in the overlay analysis. However, in the case of Gotland this trend is even enforced by permeable soil types along the east coast as well as lower amounts of precipitation that bring an even stronger increase of risk values along the lowland areas along the coastline of Gotland.

Our results illustrate that in addition to direct and irreversible loss of land, cultural features, and infrastructure such as roads, industrial land, natural reserves, and drinking water wells, the remaining part of the island will be more vulnerable to saltwater intrusion. The problem could be further accentuated by pressures from increasing population and/or population density of the coastal zone (as the island shrinks).

This means that the irreversible loss of 231 wells, according to our study, would be followed by a near irreversible loss of 120 wells that are located in the group of the highest-risk features of our GIS-vulnerability analysis. Parallel studies have shown that sea level rise may induce abrupt saltwater intrusion events due to the existence of tipping points in coastal aquifers (e.g. Mazi et al., 2013); for coastal aquifers of Gotland, the risk of such abrupt shifts appear to be high since all five parameters we used in the overlay had the highest weighing values of the highest-risk parameters.

Our study gives a basis for further investigation of different indirect consequences of sea level rise, not least economic and administrative implications. For example, present results show that a 2 m sea level rise will result in inundation of approximately 2 % of the total length of Gotland's road network. This is on a par with projected road inundations as a result of 1 to 2 m sea level rise in coastal regions of southern Europe (Demirel et al., 2015) and the USA (Koetse and Rietveld, 2009). Despite such relatively low percentage of inundation, more detailed analyses of consequences in the US case showed that impacts on transport would be large due to network effects (Koetse and Rietveld, 2009). Overall, many costs will appear due to necessary movement of inhabitants, movement/rebuild of infrastructure, leakage of contaminants from inundated polluted areas, drilling of new wells that replace saline ones, and decreasing tourism as cultural value disappears. Economic estimates need to take into account different possible scenarios where environmental features need to be weighed against economical means. This study can be the base for crucially needed future studies that include contact with the local administration to take foresighted action (cf. Libkowska and Zilniece, 2015).

With regard to industrial activities, the region that will be submerged by expected future sea level rise contains contaminated industrial land and infrastructure that may have adverse environmental effects such as gas stations. Sea level rise can hence imply that costs for mitigation measures addressing Gotland's current environmental problems may change due to changing environmental conditions; for completely submerged regions, costs for remediation may even become too high to be feasible due to an increased inaccessibility of flooded or partly flooded land. This in turn might lead to severe environmental consequences for the already burdened Baltic Sea (e.g. Garmaga, 2012).

Sea level has risen and sunk many times and intensely on geological timescales (Haq et al., 1987). Today's situation affects humans more severely than ever, due to a currently very high population and the existence of extensive infrastructure, at the coastal zones. If we regard Gotland as a "miniature world" – a fully functioning society, with all infrastructural necessities and good economic means – we still see that even this well-equipped area will suffer severe changes in the cause of climate-driven sea level rise. The present study gives only a small example of the complex scenario caused by sea level rise on Gotland, where e.g. the eco-

conomic, environmental, and life-quality consequences are not further assessed in this effect–pattern vulnerability analysis. An increase in multi-factor research on the consequences of climate driven sea level rise, as well as the distribution of the results to coastal municipalities and global exchange of experiences, is needed as soon as possible.

6 Conclusions

We performed multi-risk analysis, based on lidar data on land elevation and GIS-vulnerability mapping, to identify region-based consequences of future sea level rise and land inundation, providing a basis for understanding their contribution and significance relative to secondary effects of sea level rise and other effects of hydro-climatic change on coastal regions.

In the case of a 2 m sea level rise, 3 % of the land area of the Baltic Sea island of Gotland, corresponding to $\sim 99 \text{ km}^2$, will be inundated. The features most strongly effected, either by direct inundation or by a decrease in size, are mostly items of touristic or natural value, including the complete inundation of 35 % of all camping places, 60 % of all shore meadows, 60 % of protected sea stack areas, and 53 % of endangered plants and species habitats. In addition to direct inundation of 231 out of a total of 7354 wells, the number of wells in the high-risk zone for seawater intrusion will increase considerably, further diminishing the habitable land area of the island. Most of the effected wells are summer houses and small farms that attract summer tourists.

With nature tourism being one of the main income sources of Gotland, monitoring and planning are required to meet the changes. Some features will be irreversibly lost due to, for example, inundation of sea stacks and the passing of tipping points for seawater intrusion into coastal aquifers; others might simply be moved further inland, but this requires considerable economic means and prioritization. Seeing Gotland in a global perspective shows that holistic multi-feature studies of future consequences of sea level rise are required in order to identify the consequences for individual regions and to be able to take action adjusted to the particular needs of the region in question. Studies like the present one can provide a basis for administrative discussions and planning.

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