

Evaluation of Strategies for Pumping Optimization of Coastal Aquifers Using Numerical Simulation and Game Theory

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30 of groundwater near the coasts or even far from them can lead to saltwater intrusion from the
31 exploitation wells into the aquifer (Knight et al., 2018; Yu and Micheal, 2019a). On the other hand,
32 rising sea levels due to global warming have further caused the instability and salinization of
33 aquifers (White et al., 2005; Woodworth et al., 2009; Sanford and Pope, 2010). Under these
34 conditions, even pumping saline groundwater to desalinate the aquifer not only does not solve the
35 problem but also causes a freshwater-saltwater interface to move towards the aquifer (Stein et al.,
36 2019). Therefore, it is necessary to determine the optimal pumping rate, especially in coastal areas,
37 to conserve the strategic freshwater resources of coastal aquifers using a combination of simulation
38 models and optimization techniques. On the other hand, rehabilitation of saline aquifers by
39 biological, chemical, and physical techniques is very cost- and time-consuming, and sometimes
40 impossible due to the degree of salinity intrusion (Hussain et al., 2019). In other words, the least
41 costly way to stop or reduce the process of salinity intrusion is to determine the optimal amount of
42 freshwater pumping so that farmers bear the lowest resulting damage.

43 Since simulation models and optimization techniques alone cannot solve such problems, in
44 many studies, the combination of simulators and optimizers has been used to determine the optimal
45 pumping rate of coastal aquifers (Mantoglou, 2003; Zhou et al., 2003; Uddameri and Kuchanur,
46 2007; Javadi et al., 2012; Singh, 2014; Malmir et al., 2021).

47 Research on numerical models to simulate the interface limit and saltwater intrusion rate has
48 increased over the past two decades. In these studies, in the first stage, the groundwater flow model
49 is simulated, and in the next stage, the intrusion of saltwater is simulated by coupling the
50 groundwater flow model to the salinity transfer model (Park & Aral, 2004; Narayan et al., 2007).
51 Numerical models are highly effective in simulating saltwater intrusion, especially when the
52 transition zone is very thick (Llopis-Albert & Pulido-Velazquez, 2014). In these models, in
53 addition to simulating saltwater intrusion, scenarios such as reduced exploitation from pumping
54 wells, climate change, and structural measures have been implemented to improve aquifer
55 conditions (Luyun et al., 2011; Lu et al., 2013; Sherif et al., 2013; Qu et al., 2014; Filippis et al.,
56 2016; Abdoulhalik and Ahmed, 2017; Yu and Micheal, 2019b; Tang et al., 2020).

57 Despite the widespread use of numerical models in simulating saltwater intrusion as well as
58 various scenarios to reduce this intrusion, the issues related to saltwater intrusion management are
59 still a problem for coastal aquifers. The most important limitation of the above-mentioned studies,
60 which only rely on simulation, is facing many simulation scenarios and the lack of a managerial

61 decision based on technical, economic, and social issues. Therefore, it seems essential to manage
62 the saltwater intrusion into coastal aquifers by combining a large number of simulations by
63 numerical models and identifying the most appropriate decision from the simulation scenarios by
64 optimizing models (Singh, 2014). For example, when it is necessary to use various scenarios of
65 exploitation reduction in exploitation wells (e.g., by 1%, 2%, 3%, etc.), an optimization model
66 should determine the maximum possible exploitation volume from the aquifer to protect the
67 aquifer from the intrusion of saltwater while maximizing the exploitation from wells.

68 In this regard, according to the type of aquifer's limitations and problems, many studies have
69 been conducted with different objective functions, such as maximizing the exploitation pumping,
70 minimizing the level drop, minimizing the volume of saltwater intrusion into the aquifer, and
71 minimizing the pumping costs (Finney et al., 1992; Hallaji and Yazicigil, 1996; Emch and Yeh,
72 1998; Das and Datta, 1999; Karterakis et al., 2007; Skiborowski et al., 2012).

73 According to the literature review, optimal strategies to reduce saltwater infiltration into the
74 aquifer can be divided into conventional methods, physical barriers, and hydraulic barriers
75 (Hussain et al., 2019). Conventional methods are non-structural solutions, including pumping
76 scenarios (Sherif et al., 2013) and relocating wells. Moreover, the optimal methods of the second
77 and third categories, which are mainly structural, include a subsurface barrier, land reclamation,
78 and artificial recharge (Hussain et al., 2019).

79 Despite many studies on combined simulation-optimization methods to reduce saltwater
80 intrusion into coastal aquifers and introduce an optimal strategy, the research still suffers from two
81 main limitations. The first limitation is that all the proposed strategies are presented regardless of
82 the satisfaction of the stakeholders or farmers of the region. In other words, the proposed strategies
83 are top-down and solid and can cause dissatisfaction among farmers, which will ultimately reduce
84 their success rate. The second limitation is that the economy of the proposed strategies has not
85 been analyzed by optimization models, and they impose a heavy financial burden on the farmer or
86 the government in many cases.

87 Therefore, in this study, for the first time, the most appropriate scenario or strategy is
88 identified using cooperative game theory (considering government and farmers as the players)
89 based on economic and social indices. To do this, a combination of the simulation model with
90 SEAWAT and game theory optimization model has been used in Astaneh-Kouchesfahan, as one

91 of the coastal aquifers in Iran and the center of tourism and agriculture (rice crop). Finally, the
92 proposed strategies will be investigated by analyzing economic and social indices.

93 **2. Materials and methods**

94 ***2.1. Methodology***

95 One of the fundamental challenges in coastal aquifers is the reduction of groundwater level
96 due to increased exploitation and the consequent reduction of the hydraulic gradient of the flow in
97 part leading to the sea. The result is the saltwater intrusion with greater density from the bottom
98 of the aquifer to its center. This phenomenon gradually causes land reclamation and degradation
99 of the quality of exploitation wells in these areas, and its continuation can even destroy essential
100 parts of the aquifer. Therefore, developing appropriate treatment strategies to control this
101 environmental problem requires the participation of all stakeholders using a cooperative game
102 model. Figure 1 depicts the flowchart of this research. In the first step, after collecting statistics
103 and information of the region, the quantitative and qualitative status of the aquifer was simulated
104 using the MODFLOW and MT3D codes, respectively, in the GMS software environment. In the
105 next step, using the SEAWAT numerical model, saltwater intrusion in the aquifer outlet was
106 determined in three dimensions. To provide practical strategies, several indices were defined for
107 the parties of a non-cooperative two-player game model. The economic and social satisfactions
108 were considered as the indices of the farmers of the region. Moreover, the improvement of the
109 qualitative conditions of the aquifer and the costs of implementing the strategies for water
110 resources treatment were considered as the indices of the government. These indices were applied
111 based on a weighting method in the game model, and finally, the appropriate strategies to reduce
112 saltwater intrusion were evaluated in achieving the minimum cost and the highest level of social
113 satisfaction.

114

115

Figure 1. Research flowchart

116 ***2.2. Study area***

117 The southern region of the Caspian Sea in Iran has had the most significant potential in the
118 agricultural sector and the tourism industry of this country. However, in recent years, due to
119 excessive and unstable development, it has faced a remarkable increase in the exploitation of its

120 groundwater resources. The Astaneh-Kouchesfahan aquifer (48°48' - 50°25' N, 37°0' -39°50') is
121 located in a humid climate with an average precipitation of 1500 mm. Most of the groundwater
122 and surface water resources in this area are utilized in agriculture, and more specifically, rice
123 cultivation. With an area of 1300 km², it is an alluvial aquifer that is confined in the southwestern
124 parts. This aquifer extends from Sefidroud alluvial fan to the sea, and except for the younger
125 alluviums, which are located in the surface part of the alluvial fan, the alternation of fine-coarse
126 grained elements or all fine-grained elements are seen in other parts of the plain. On the other hand,
127 heavy precipitation in this area, which even reaches 1600 mm in some places, is an essential factor
128 in aquifer recharge. However, in most parts of the Astaneh plain, despite the high volume of
129 alluvial areas, groundwater exploitation is not easy due to the presence of fine-grained deposits.

130 The geological formations that outcrop from Precambrian to Quaternary include various
131 rocks and deposits such as limestone, shale, sandstone, conglomerate, and inner and outer igneous
132 rocks, as well as various types of destructive deposits such as sand, gravel, and coastal deposits
133 (Figure 2). The Astaneh-Kouchesfahan aquifer is not structurally integrated and includes changes
134 according to the geological structure and stratification. According to geophysical studies
135 conducted in the region, the minimum and maximum alluvial thicknesses are 100 and 250 m,
136 respectively. The bedrock of the plain is a lake deposit, the thickness of which reaches up to 1000
137 m according to the available information. During exploratory studies, including drilling eight
138 exploratory wells, the transmissivity in this plain is estimated between 100 to 6000 m²/day, and
139 the average storage coefficient is 2%. The water level in this plain generally varies between 1 to 4
140 m. The water resources balance in this area shows that more than 41 MCM are extracted annually
141 through wells in the region, which has caused a drop in groundwater level in the outlet sections of
142 the aquifer that leads to the sea. This drop in the aquifer in the outlet section has changed the
143 hydraulic gradient and reduced the volume of groundwater outflows. This has caused the saltwater
144 intrusion from the sea to the coastal areas due to the higher density of the seawater in the outlet
145 section.

146 Figure 2. Study area

147

148 ***2.3. Simulation of saltwater intrusion***

149 In this study, to simulate saltwater intrusion, it was first necessary to simulate groundwater
 150 flow using MODFLOW and then simulate concentration changes using MT3D, and finally,
 151 simulate saltwater intrusion due to changes in water density. To simulate water flow under the
 152 influence of density changes, the SEAWAT model was used to analyze the density changes.
 153 According to Eq. (1), the flow is simulated under the influence of density change

$$\begin{aligned} \frac{\partial}{\partial x} \left[\rho K_x \left(\frac{\partial h_f}{\partial x} + \frac{\rho - \rho_f}{\rho_f} \frac{\partial Z}{\partial x} \right) \right] + \frac{\partial}{\partial y} \left[\rho K_y \left(\frac{\partial h_f}{\partial y} + \frac{\rho - \rho_f}{\rho_f} \frac{\partial Z}{\partial y} \right) \right] + \frac{\partial}{\partial z} \left[\rho K_z \left(\frac{\partial h_f}{\partial z} + \frac{\rho - \rho_f}{\rho_f} \frac{\partial Z}{\partial z} \right) \right] \\ = \rho S_f \frac{\partial h_f}{\partial t} + \theta \frac{\partial \rho}{\partial C} \frac{\partial C}{\partial t} - p_s q_s \end{aligned} \quad (1)$$

154 where x , y , and z are flow directions, K_x , K_y , and K_z are hydraulic conductivity in flow directions
 155 (LT^{-1}), S_f is storage coefficient in the freshwater aquifer (L^{-1}), h_f is equivalent of water level in the
 156 freshwater aquifer, θ is effective porosity, ρ is the density of the saltwater, ρ_f is the density of the
 157 freshwater, ρ_s is the density of inlet water from a source, q_s is the volumetric velocity rate per unit
 158 volume of the aquifer (T^{-1}), C is the concentration of saltwater (LT^{-3}), and t is time.

159 After simulating the flow and concentration using MODFLOW and MT3D models, the
 160 saltwater intrusion simulation from a saltwater resource (such as the sea) to a freshwater resource
 161 was performed simultaneously based on hydraulic gradients of the water density changes. This
 162 simulation was performed using the SEAWAT model and defining the aquifer outlet boundary in
 163 the coastal strip based on changes in concentration and density. Eq. (2) shows the numerical
 164 analysis of the simulation due to changes in concentration and density in the coastal aquifer
 165 simultaneously

$$\left[1 + \frac{\rho_b K_d}{\theta} \right] \frac{\partial(\theta C^k)}{\partial t} = \frac{\partial}{\partial x_i} \left[\theta D_{ij} \frac{\partial c^k}{\partial x_j} \right] - \frac{\partial}{\partial x_i} [\theta v_i c^k] + q_s c_s^k + \sum R_n \quad (2)$$

166 where ρ_b is apparent density ($\rho_b = M_s/V_t$), K_d is linear absorption coefficient (distribution
 167 coefficient), θ is porosity (dimensionless), c^k is the concentration of solution k , T is time, x_{ij} is the
 168 distance along with the Cartesian coordinates, D_{ij} is the tensor of hydrodynamic diffusion
 169 coefficient, v_i is water velocity in a porous medium or Darcy flow velocity, q_s is the volumetric
 170 velocity rate per unit volume of the aquifer, and $\sum R_n$, is the unit of the chemical reaction.

171 According to Eq. (2) and figure 3, several variables, such as saltwater density, freshwater
 172 density in the coastal strip, hydraulic conductivity in the coastal strip, chloride (Cl⁻) concentration,
 173 and the slope of concentration change gradient, were required to simulate the interface limit of

174 saltwater and freshwater along the length and depth of the coastal strip and the intrusion of
175 saltwater.

176

177 Figure 3. A schematic figure shows the conception of the saltwater intrusion approach with density and
178 initial concentration of Chloride (mg/l) conceptual model of the aquifer

179 *2.3.1. Conceptual model*

180 The first step to simulate the saltwater intrusion into the groundwater aquifer was to prepare
181 a conceptual model of the aquifer, including boundary conditions, surface grids, depth and limit
182 of the interface, and its geological structure. Since the SEAWAT model structure considers the
183 nature of saltwater intrusion from the sea in three dimensions, the third dimension in the depth of
184 the aquifer was designed in five layers according to the thickness of the aquifer in the aquifer outlet
185 (coastal strip). Since stratification is essential in high depths, the size of each grid cell was
186 considered 1000 by 1000 m on the surface and 2.5 m in depth. The number of cells and layers
187 considered in the aquifer depth was according to the aquifer thickness in the coastal area. A
188 quantitative model (i.e., MODFLOW) and a qualitative model (i.e., MT3D) of the aquifer were
189 prepared to simulate saltwater intrusion by the SEAWAT package. The period of quantitative and
190 qualitative modeling was considered five years from 2012 to 2017. Modules considered in the
191 MODFLOW code included inlet and outlet groundwater fronts of GHB type, aquifer recharge
192 (from return water and infiltration of precipitation and runoff), and discharge (from exploitation
193 wells). In the next step, the coastal strip (Figure 4) was simulated using MT3D and SEAWAT
194 qualitative models in order to investigate the intrusion of saltwater fronts in the aquifer outlet.
195 Advection and dispersion processes were used to simulate the transfer of solutes during the
196 simulation with the MT3D model. For qualitative simulation according to the intrusion of
197 saltwater, the chloride (Cl⁻) was selected as a qualitative variable. After determining the boundary
198 conditions in quantitative modeling, the boundary conditions of the qualitative conceptual model
199 of the aquifer were defined based on the fronts of chloride concentration entering the aquifer.
200 According to Figure 4, three inlet fronts, including the aquifer surface (recharge from the return
201 water, I₁), the concentration of saltwater entering from the coastal strip (GHB boundary layer at
202 the end of the aquifer, I₂), and the concentration entering from the inlet boundary of groundwater

203 flow (GHB boundary layer at the beginning of aquifer, I₃), were considered in the qualitative
204 conceptual model.

205 After qualitative simulation using the MT3D model and determining the changes in chloride
206 concentration and how it enters the aquifer, the SEAWAT model was used to determine the amount
207 of intrusion into the aquifer as a measure of freshwater and saltwater interface limit. In this model,
208 the boundary of saltwater fronts versus the boundary of freshwater fronts was defined as GHB
209 based on the MT3D model's results. The VDF package was used In the SEAWAT model to
210 determine the initial concentration of chloride in the aquifer (freshwater) and the concentration of
211 chloride in saltwater, as well as the density of saltwater and freshwater. According to the available
212 information, the average density of saltwater in the outlet of the aquifer is 1025 kg/m³, while the
213 salt concentration is 33 kg/m³. Therefore, the change in density/concentration slope, which is
214 introduced as DRHODC, was obtained using Eq. (3).

$$\text{Density/concentration . slop(DRHODG)}: \frac{1025(\text{kg/m}) - 1000(\text{kg/m}^3)}{33(\text{kg/m}^3) - 0(\text{kg/m}^3)} = 0.75 \quad (3)$$

215 Similar to the MODFLOW quantitative and MT3D qualitative models, the simulation period was
216 considered three years to determine the advancement of saltwater.

217

218 Figure 4. Study area and the conceptual model of the aquifer

219 ***2.4. Developing a conflict resolution model***

220 One of the essential aspects of groundwater resources management is decision making and
221 providing solutions with a view to sustainable development. In other words, water supply and
222 maintaining the quantity and quality of the aquifer at the lowest cost and the highest level of social
223 satisfaction is one of the most important goals of groundwater resources management (Thomann
224 et al., 2020). On the other hand, these goals are feasible when all stakeholders and government are
225 involved in the decision-making process. Of course, this makes the decision-making conditions
226 very difficult due to the multiplicity of decision-makers and their views and even causes conflicts.
227 Therefore, in such circumstances, all the desirability, disagreements, and relative power of
228 decision-makers should be considered in providing the final solution. There are several methods
229 to develop conflict resolution models. The Nash conflict resolution theory is one of the methods
230 of game theory that involves disagreements and the risk of the presence of the participants or

231 players. Nash proves that if H is a convex, closed, and finite function, there will be only one
 232 solution ($\varphi(H,d)$) for the conflict resolution, which is obtained by solving the optimization problem
 233 of Eq. (4)

$$\begin{aligned} \text{Maximize: } & \prod_{i=1}^N (f_i - d_i)^{c_i} \quad ; \quad c_i > 0 \\ \text{s. t: } & d_i \leq f_i \leq \bar{f}_i \quad (i = 1, 2, \dots, N) \end{aligned} \tag{4}$$

$$(f_1, \dots, f_n) \in H$$

234 Where f_i is the maximum desirability that can be involved with the player i , and c_1, c_2, \dots, c_i
 235 represent the relative weight of the stakeholders and the relative power of the decision-makers. In
 236 the case of implementing a cooperative game between the parties, all these coefficients will be
 237 equal to 1. In contrast, in non-cooperative game models and having relative power, these
 238 coefficients will have different values, and their sum equals 1.

239 One of the essential parts of game model development is defining indices for evaluations
 240 and final decision-making. These indices are defined based on the goals and desires of the game
 241 parties. As a party to the game, the stakeholders of the region generally use the exploited
 242 groundwater resources for agricultural purposes. If the groundwater exploitation is reduced by the
 243 other side of the game, the farmers' economy will face critical problems, and social conflicts such
 244 as unemployment or rebellion will occur. Therefore, the most important index to assess the
 245 evaluation of the farmer as a player in the game model is socio-economic satisfaction. On the other
 246 hand, over-exploitation reduces the groundwater level in the aquifer and decreases the quality of
 247 the aquifer due to saltwater intrusion. Therefore, to balance the aquifer, an index can be considered
 248 for the governmental custodians of water supply as the player of the other side of the game:
 249 improving the qualitative condition of the aquifer. Moreover, as the custodian of the water supply,
 250 the government should spend money to maintain the sustainable use of the aquifer. Therefore, an
 251 economic index can also be considered as an index of the cost of aquifer sustainability for the
 252 government. Therefore, in total, an index (socio-economic satisfaction) for the stakeholders in the
 253 region and two indices (improving the qualitative status of the aquifer and the cost of aquifer
 254 sustainability) for the government were defined in this study.

255 *2.4.1. Socio-economic satisfaction.*

256 Satisfaction is a concept derived from economic development, and this development occurs when
 257 poverty and its symptoms are removed from society. This is seen when the fair distribution of
 258 resources is conducted to increase the welfare of society (Keane et al., 2008). To define an index
 259 for measuring satisfaction, the real stakeholders should first be identified, and their satisfaction
 260 should then be evaluated. The social satisfaction index defines as stakeholders' participation in
 261 groundwater management, education and information, law, equitable allocation, and social justice.
 262 The PI combined index is used to develop an appropriate socio-economic index in evaluating
 263 coastal aquifer treatment strategies (Castilla-Rho et al., 2019). This index is a combination of three
 264 scores: economic, institutional, and social. The economic score is directly proportional to the gross
 265 margin of crop production and includes costs related to the area under cultivation and pumping.
 266 The institutional score is defined as the percentage of satisfaction (0-100%) in implementing
 267 treatment strategies. Social score involves evaluating the rate of exit from the project by the
 268 stakeholders. This score measures the degree of non-cooperation with the governmental custodians
 269 to implement the treatment strategies (non-acceptance of the rules). Accordingly, this index is
 270 defined as Eq. (5) (Castilla-Rho et al., 2019).

$$PI = E \times I \times S \quad (5)$$

271 2.4.2. Aquifer qualitative sustainability.

272 Since the aquifer outlet in the coastal area is affected by the influence of saline seawater, the
 273 aquifer qualitative sustainability index was used to assess the aquifer quality. This index is based
 274 on the length of the saltwater intrusion (Eq. 6)

$$\alpha_L = 100 \times \left(\frac{L_{Int} - L_{qs}}{L_{Int}} \right) \quad (6)$$

275 Where L_{qs} is the length of saltwater intrusion after applying the scenario (m/km), L_{Int} is the length
 276 of saltwater intrusion in the initial conditions (without applying the scenario) (m/km), and α_L is the
 277 qualitative sustainability index (%). The range of changes of this index is between +1 to $-\infty$. The
 278 closer the value of this index is to +1, the better the aquifer quality in terms of saltwater intrusion
 279 and causes saltwater recession. The intrusion of saltwater reduces this index, and the intrusion
 280 length in the initial conditions and after applying the scenarios is obtained based on the simulation
 281 results of the SEAWAT model.

282 2.4.3. Aquifer sustainability cost.

283 Implementing various scenarios to improve the poor quality of the aquifer in a region by the
284 government requires costs. On the other hand, the amount of money spent along with the
285 participation and satisfaction of farmers will achieve maximum efficiency. In order to estimate
286 this index, the costs of implementing the scenarios for the aquifer sustainability were estimated
287 and normalized using Eq. (7) to be applied in economic calculations

$$C = \frac{C_{max} - C_i}{C_{max}} \quad (7)$$

288 Where C_{max} is the maximum cost of implementing the scenarios and C_i is the cost of each scenario.
289 C has a value between 0 (for a solution with the highest implementation cost) and 1 (for a solution
290 with the lowest implementation cost).

291 **2.5. Scenarios**

292 In this study, to reduce saltwater intrusion, scenarios with managerial and structural
293 objectives were developed. The managerial scenario was more focused on the aquifer outlet and
294 included exploitation reduction from wells in the area. Moreover, the structural scenario included
295 artificial recharge and constructing an underground dam. Besides, to further improve the
296 quantitative and qualitative condition of the aquifer, combinations of these scenarios were also
297 considered. Based on this, 19 strategies were considered in this study to improve the aquifer
298 condition (Table 1). According to the table, exploitation reduction was considered at four levels of
299 5, 10, 15, and 20%.

300 **3. Results and discussion**

301 **3.1. Simulation results of saltwater intrusion**

302 In this study, the saltwater intrusion was simulated using SEAWAT numerical model. After
303 the calibration of the model in quantitative mode by MODFLOW to simulate the flow, the solute
304 transfer model of MT3DMs was performed based on chloride concentration changes for qualitative
305 simulation. Calibration in the qualitative model was performed by trial and error method, and
306 longitudinal dispersion was analyzed and calibrated. Due to the lack of data related to the pollution
307 transfer, the calibration of the longitudinal dispersion coefficient was performed using the
308 hydraulic conductivity, the type of geological formations in the area, the slope of the aquifer outlet,
309 land use, and qualitative samplings. Figure 5 depicts the changes in chloride concentration in the
310 aquifer at the end of the simulation period. The results of a 5-year simulation period in the aquifer

311 outlet showed that the chloride concentration in the western part increased more than in other parts.
312 The western part of the aquifer has been affected by the intrusion of seawater up to a distance of
313 more than 1 km, and the chloride concentration has reached more than 280 mg/l. The study of
314 groundwater exploitation networks shows that the volume of exploitation of groundwater
315 resources in the western part is higher than that in the eastern part. This is the most crucial reason
316 for the increase of saltwater intrusion in western parts. On the other hand, the eastern part of the
317 aquifer is affected by surface water flows. The Sefidroud river is the largest source of surface water
318 in this region, so the rate of increase in chloride concentration is lower than that in the western
319 part.

320

321 Figure 5. Simulation of the MT3DMs model in the aquifer outlet section

322 After simulating the chloride concentration changes in the aquifer using the MT3DMs
323 model, the saltwater intrusion was performed using the SEAWAT model. In this model, by
324 introducing the parameters of the VDF package in the model, the initial concentration of chloride
325 in the aquifer, the concentration of salt in the saltwater, and the density of saltwater and freshwater
326 were considered as the initial and boundary conditions. Figure 6 depicts the simulation results at
327 the aquifer depth and saltwater intrusion into the deep layers. The simulation results in the aquifer
328 depth showed that saltwater intrusion was 740 m during the 5-years study period from 2012 to
329 2017. This intrusion is mostly due to groundwater exploitation and hydraulic gradient reduction.

330

331 Figure 6. Three-dimensional view of SEAWAT model in the aquifer outlet

332 ***3.2. Evaluating the indices of the conflict resolution model***

333 In the proposed game model, three indices of aquifer qualitative sustainability, aquifer
334 sustainability cost, and socio-economic satisfaction of stakeholders in the region were considered.
335 Stakeholders in the region include farmers in the aquifer outlet who use the exploited water. The
336 other side is the water sector managers as the representatives of the government, which involve
337 the two indices of aquifer qualitative sustainability and aquifer sustainability cost in the conflict
338 resolution model.

339 After applying the treatment strategies in the SEAWAT model, the saltwater intrusion and
340 the aquifer qualitative sustainability index were calculated using Eq. (6). Each treatment strategy
341 was economically analyzed, and based on this, the cost of implementing the solutions was
342 calculated. The highest implementation cost belonged to the construction of the underground dam,
343 while the lowest cost was related to the aquifer exploitation reduction. After the normalization of
344 economic values, the aquifer sustainability cost was calculated (Table 1). A total of 40
345 questionnaires was distributed among the farmers in the west, east, and center of the region to
346 estimate the socio-economic satisfaction index in the region. The number and method of
347 completing the questionnaires were determined using the Delphi method. Socio-economic
348 satisfaction was assigned a score between 0 and 1 with a Likert scale for each strategy. A score of
349 0 indicated dissatisfaction, and a score of 1 indicated the maximum level of satisfaction.

350 Due to the non-cooperative game approach for the conflict resolution model, each side of
351 the game should be determined by one index. Therefore, for the government player in this study,
352 the two indices of aquifer qualitative sustainability and aquifer sustainability cost were combined
353 by weighting using analytic hierarchy process (AHP), the resulting index was then called the
354 government index (Table 1). In order to weigh by AHP, 30 questionnaires were distributed among
355 and water experts and managers in the region. Based on the results, the weights of the aquifer
356 qualitative sustainability and sustainability cost indices were obtained to be 0.6 and 0.4,
357 respectively.

358 Table 1 shows that by increasing the amount of aquifer qualitative sustainability, social
359 satisfaction decreases sharply. Increasing the aquifer quality index has a direct relationship with
360 decreasing water exploitation or increasing aquifer recharge. Therefore, due to the important role
361 of agriculture in their livelihood, farmers strongly opposed reducing the level of water exploitation.

362

363

Table 1. Indices of conflict resolution parties in the game model

364 ***3.3. Determining the optimal minimum (F^*)***

365 Given the game model approach using the asymmetric Nash equation in this study,
366 determining the optimal minimum for each index and each player is essential. The concept of
367 optimal minimum in the Nash equation indicates the entry of a strategy into the game model.
368 Strategies in which the index value of each player is less than the optimal minimum do not enter

369 the game model. Determining the optimal minimum was conducted based on the purpose of this
370 study and the comments from experts. According to the condition of the Astaneh-Kouchesfahan
371 aquifer and the importance of saltwater intrusion, the optimal minimum for the qualitative
372 sustainability index was considered to be 0.5. This value means a 370-m recession of the saltwater.
373 The minimum aquifer sustainability cost was considered zero due to the importance of lowering
374 the costs by the government. This means that the maximum cost to recover the aquifer is borne by
375 the governmental management of water resources. Therefore, according to the weight of 0.6 and
376 0.4 considered for the two indices of qualitative sustainability and sustainability cost, the optimal
377 minimum for the government index was calculated to be 0.3. To determine the optimal minimum
378 for socio-economic satisfaction based on the decision-making in a democratic environment, 50%
379 was considered for the optimal minimum of this index.

380 ***3.4. Prioritizing the selected strategies***

381 After calculating the indices of the two parties of the game, the final value of the game model
382 index for each player was calculated based on the asymmetric Nash equation. Based on the results,
383 only 12 treatment strategies were entered the game model, and the rest, which had index values
384 less than the optimal minimum, omitted. The strategies that entered the game model were
385 prioritized based on the maximum Nash index. Table 2 shows the prioritization of the best five
386 strategies along with their calculated Nash index values. According to the table 2, despite of
387 decreasing in the high rate of saltwater intrusion in the fourth priority (410 meter) compared to the
388 continuation of the business as usual (740 meter), but taking into account social, economic
389 indicators and finally the output of game theory the artificial recharge in the aquifer outlet section
390 has been selected as the first priority agreed between the parties to the game. The technical analysis
391 of this strategy in the SEAWAT model shows that the control of saltwater intrusion and a water
392 recession equal to 150 m occurred during a 5-year simulation period. After this strategy, in terms
393 of increasing the qualitative sustainability index of the aquifer, the combined strategy of
394 constructing the underground dam and artificial recharge resulted in a qualitative sustainability
395 index of 0.55 and a 410 m recession of saltwater in the aquifer outlet. Figure 7 shows the simulation
396 results of the first and second priority strategies for the aquifer qualitative sustainability index.
397 Table 2 indicates that all the selected strategies had socio-economic satisfaction indices higher

398 than 70%. Therefore, sensitivity analysis of the indices of this game model was necessary to
399 analyze the results.

400

401 Table 2. Prioritization of the selected strategies

402

403 Figure 7. Results of saltwater intrusion by SEAWAT model from the sea for the all strategies: a) Business
404 as usual b) Artificial recharge c) Underground dam d) 5% Exploitation reduction e) Underground dam + Artificial
405 recharge f) 5% Exploitation reduction + artificial recharge

406 ***3.5. Sensitivity analysis of the game model***

407 Given the results obtained from the prioritization of treatment strategies, a sensitivity
408 analysis of the game model indices was necessary. According to the use of the asymmetric Nash
409 model, the sensitivity of the two weights of the government player indices and relative power
410 coefficient (α) of players were analyzed. The values of the two indices of aquifer qualitative
411 sustainability and aquifer sustainability cost varied between 0.2 and 0.8 for sensitivity analysis
412 (Figure 8). The results showed that by increasing the weight of the aquifer qualitative sustainability
413 index, the combined strategy of artificial recharge and construction of the underground dam was
414 the first priority. This strategy had the maximum socio-economic satisfaction with high qualitative
415 sustainability. By reducing the weight of the aquifer qualitative sustainability index, artificial
416 recharge was selected as the strategy with high priority. This strategy also provided maximum
417 socio-economic satisfaction.

418

419 Figure 8. Sensitivity analysis of the weight of qualitative sustainability and sustainability cost indices

420 The second technique to analyze the sensitivity of the game model is to change the relative
421 power between the two players. This coefficient varied between 0.3 and 0.7, and the results were
422 analyzed. By increasing the relative power of the parties to the game, an attempt was made to
423 determine a range for changing the prioritization of treatment strategies. Figure 9 shows the
424 changes in the relative power of the government player due to the various strategies that have
425 entered the game model. The results indicate that by increasing the relative power of the
426 stakeholders, the artificial recharge strategy had more priority. In contrast, the exploitation
427 reduction equal to 5% was chosen as the first priority by increasing the relative power of the
428 government.

429

430 Figure 9. The sensitivity analysis of the relative power of the government in the conflict resolution model

431 **4. Conclusion**

432 Using a combination of managerial and structural scenarios, strategies for coastal aquifer
433 management against saltwater intrusion were presented in this study. In the first step, by simulating
434 the saltwater intrusion into the coastal aquifer using the SEAWAT package, it was determined that
435 the saltwater advanced up to 740 m from the coastal area to the aquifer after a 5-year period.
436 Therefore, a set of management strategies was proposed to reduce this environmental damage. In
437 previous studies, several structural strategies were evaluated, some of which, such as surface and
438 subsurface physical barriers, had high construction costs despite their high efficiency (Hussain et
439 al., 2019). In other studies, using non-structural and managerial approaches and using optimization
440 models (Singh, 2014), the optimal pumping was determined to reduce the aquifer exploitation and
441 saltwater intrusion. On the other hand, it has been observed in many studies that the use of non-
442 structural strategies such as reducing aquifer exploitation can result in the dissatisfaction of
443 stakeholders and many social conflicts (Ghafouri et al., 2020). The literature review shows that
444 structural and non-structural strategies can lead to failure in terms of cost imposition and social
445 dissatisfaction. Therefore, in this research, a combined simulator-optimizer, i.e., the SEAWAT-
446 game theory model, was used to prioritize the proposed strategies for each region.

447 The results obtained for the study area showed that the exploitation from the Astaneh-
448 Kouchesfahan coastal aquifer in northern Iran, despite abundant surface water resources, has led
449 to the advancement and intrusion of saltwater. The results of the SEAWAT package showed that
450 if the exploitation from the aquifer continues in its current form, the saltwater will advance by 740
451 m in the next five years. This intrusion in the near future will degrade the quality of a significant
452 portion of the aquifer. Therefore, in this study, 19 structural and non-structural strategies were
453 proposed to reduce saltwater intrusion. Since previous studies have shown that structural and non-
454 structural strategies have their own advantages and disadvantages, the selected strategies were
455 prioritized using an optimization model. According to the results of a model based on game theory,
456 out of 19 strategies, five strategies had priority in terms of socio-economic satisfaction. The results
457 of prioritization showed that the two strategies of artificial recharge and underground dam were
458 the most effective solutions in reducing the saltwater intrusion, so that the implementation of these

459 strategies reduces the saltwater intrusion from 740 m by 150 and 300 m, respectively. Therefore,
460 by using the combined simulator-optimizer method presented in this study, various solutions can
461 be evaluated to propose the most appropriate solution with the lowest cost and maximum
462 satisfaction for the sustainable management of coastal aquifers.

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570

Figures

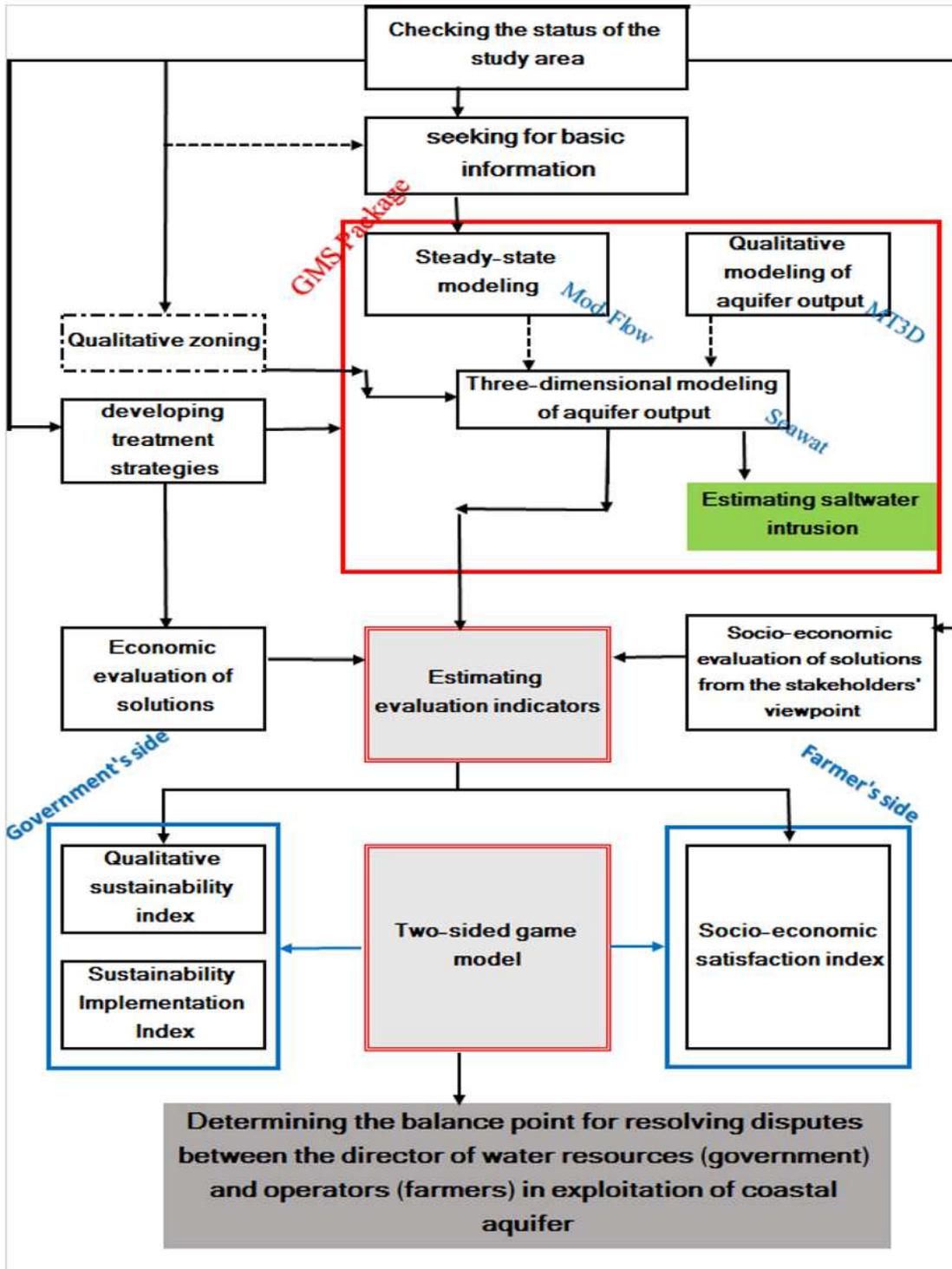


Figure 1

Research flowchart

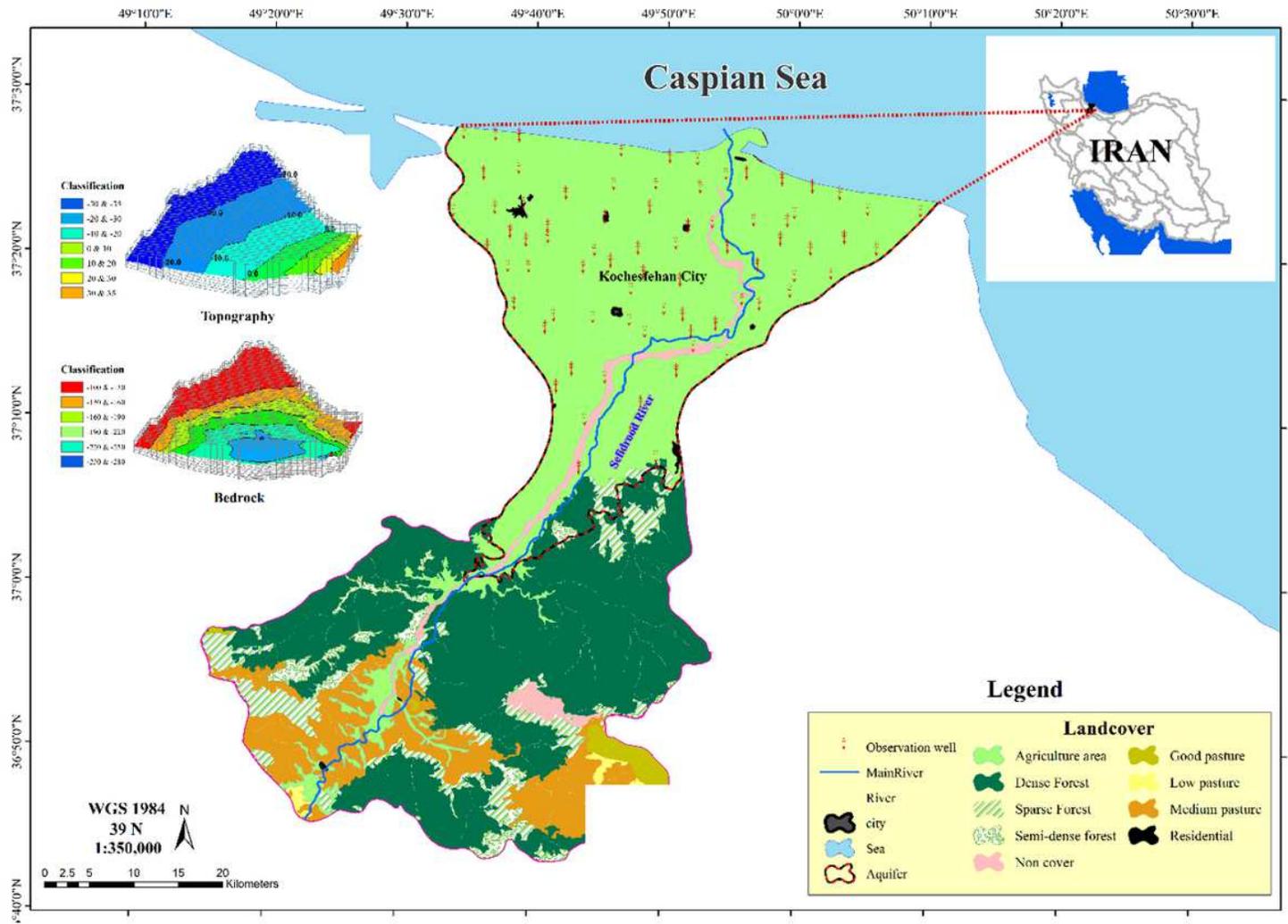


Figure 2

Study area

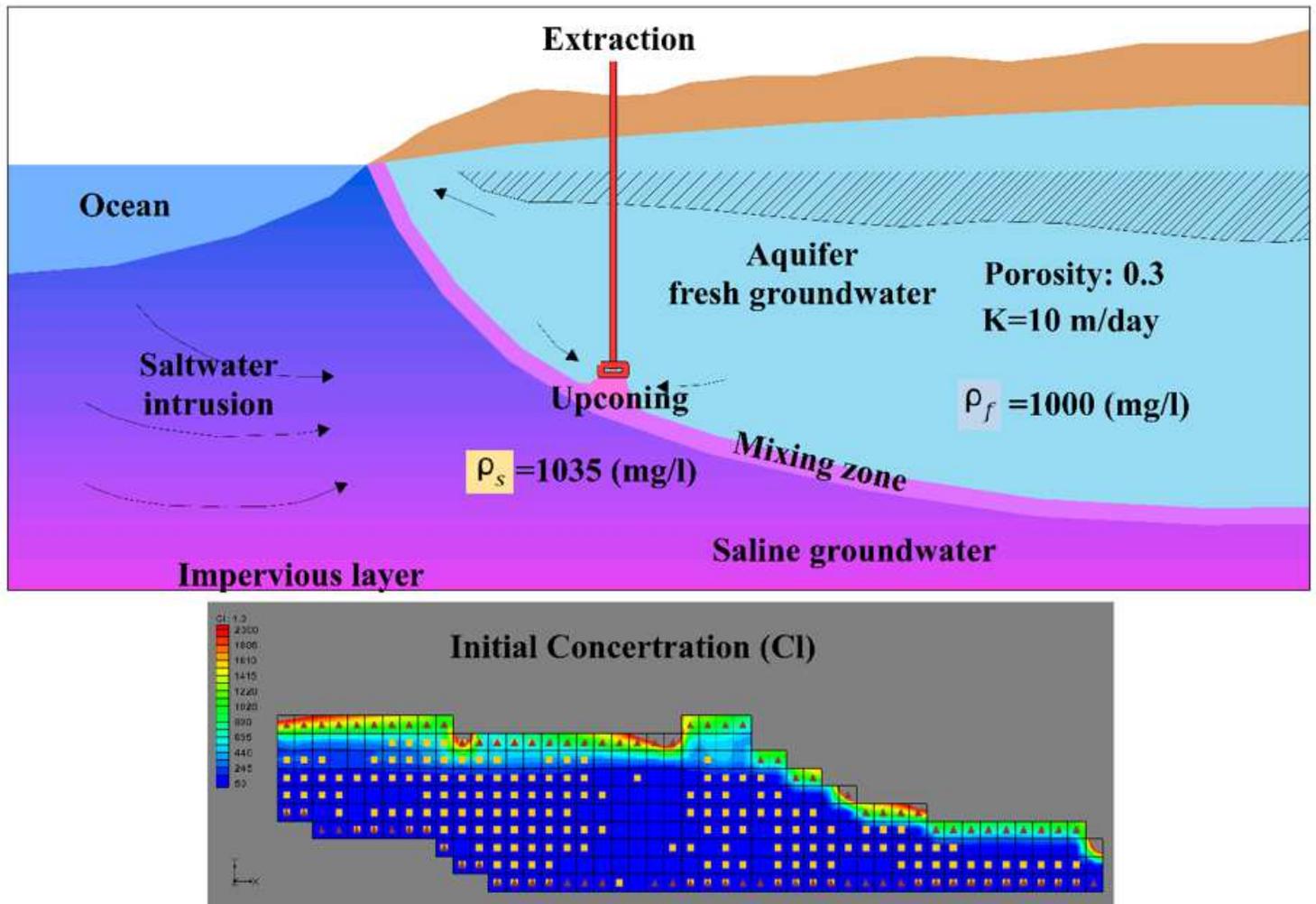


Figure 3

A schematic figure shows the conception of the saltwater intrusion approach with density and initial concentration of Chloride (mg/l) conceptual model of the aquifer

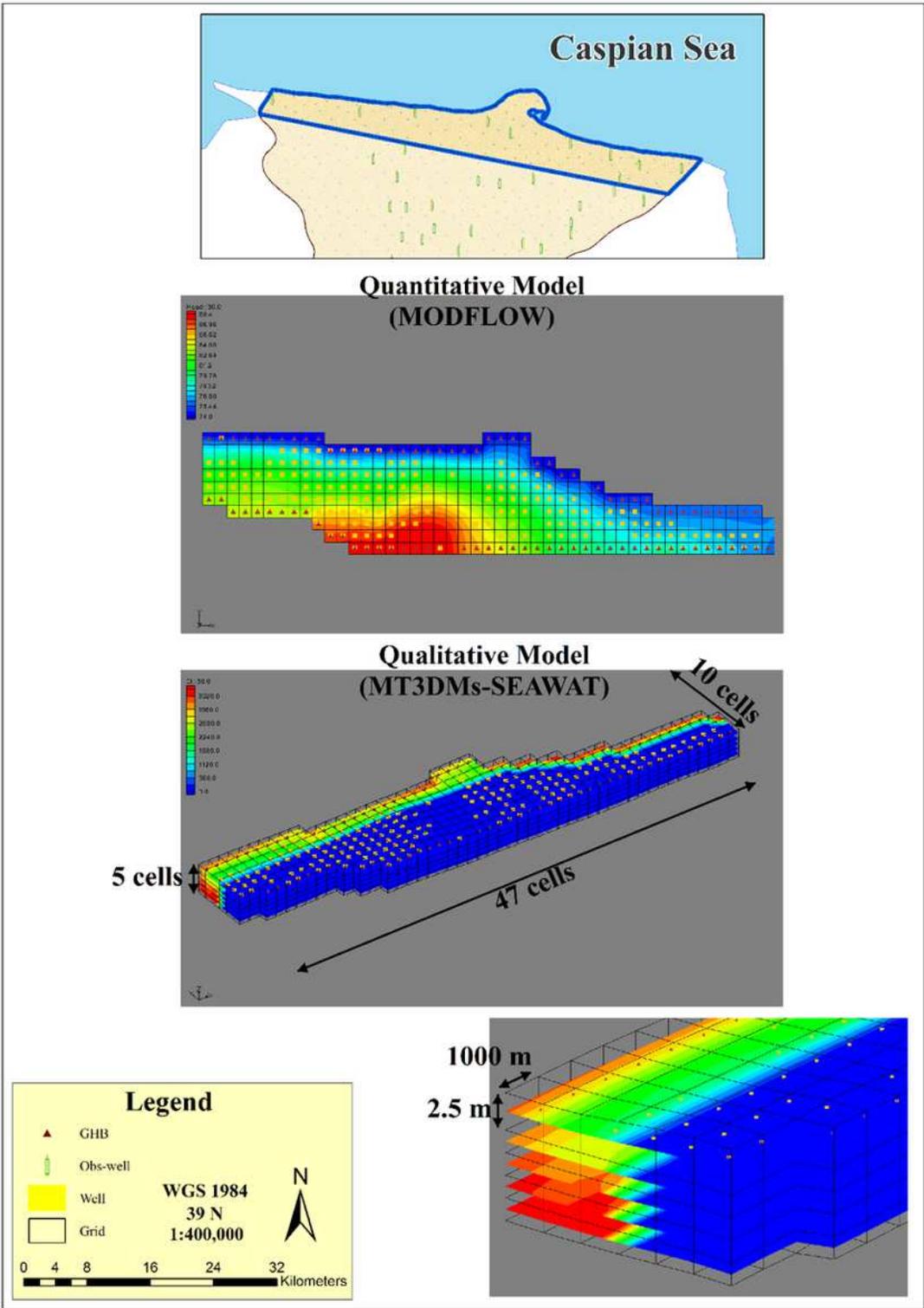


Figure 4

Study area and the conceptual model of the aquifer

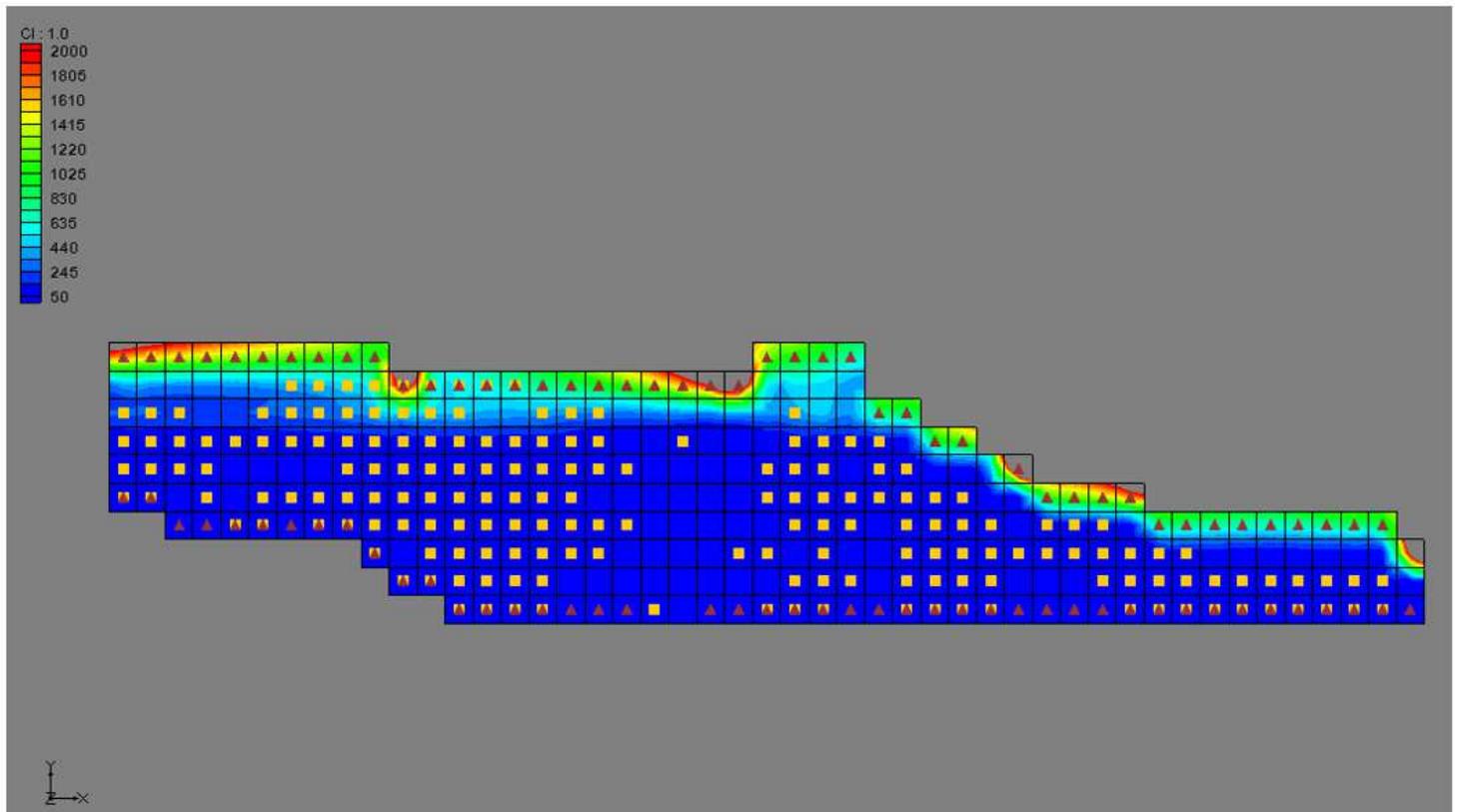


Figure 5

Simulation of the MT3DMs model in the aquifer outlet section

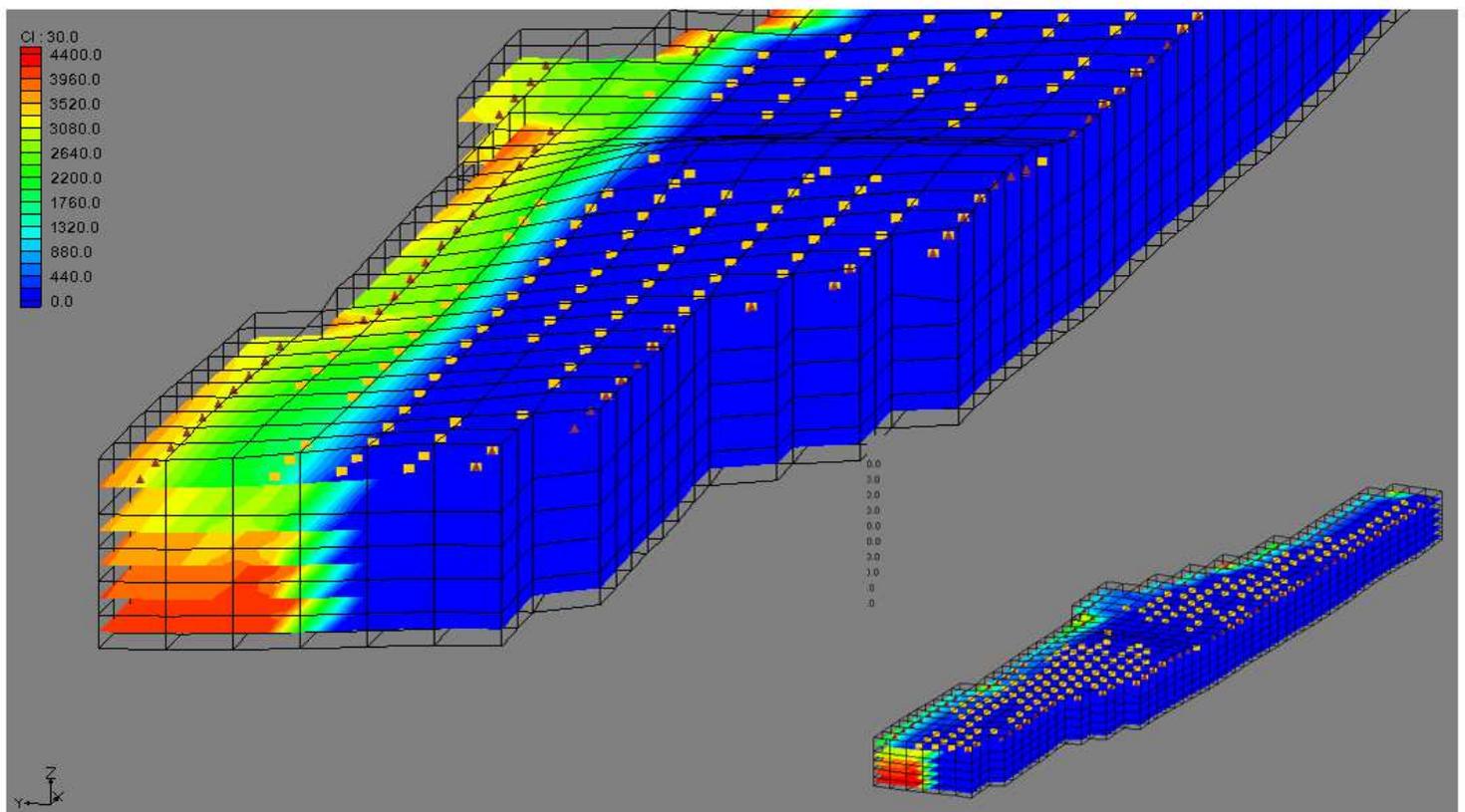


Figure 6

Three-dimensional view of saltwater and freshwater interface model in the aquifer outlet

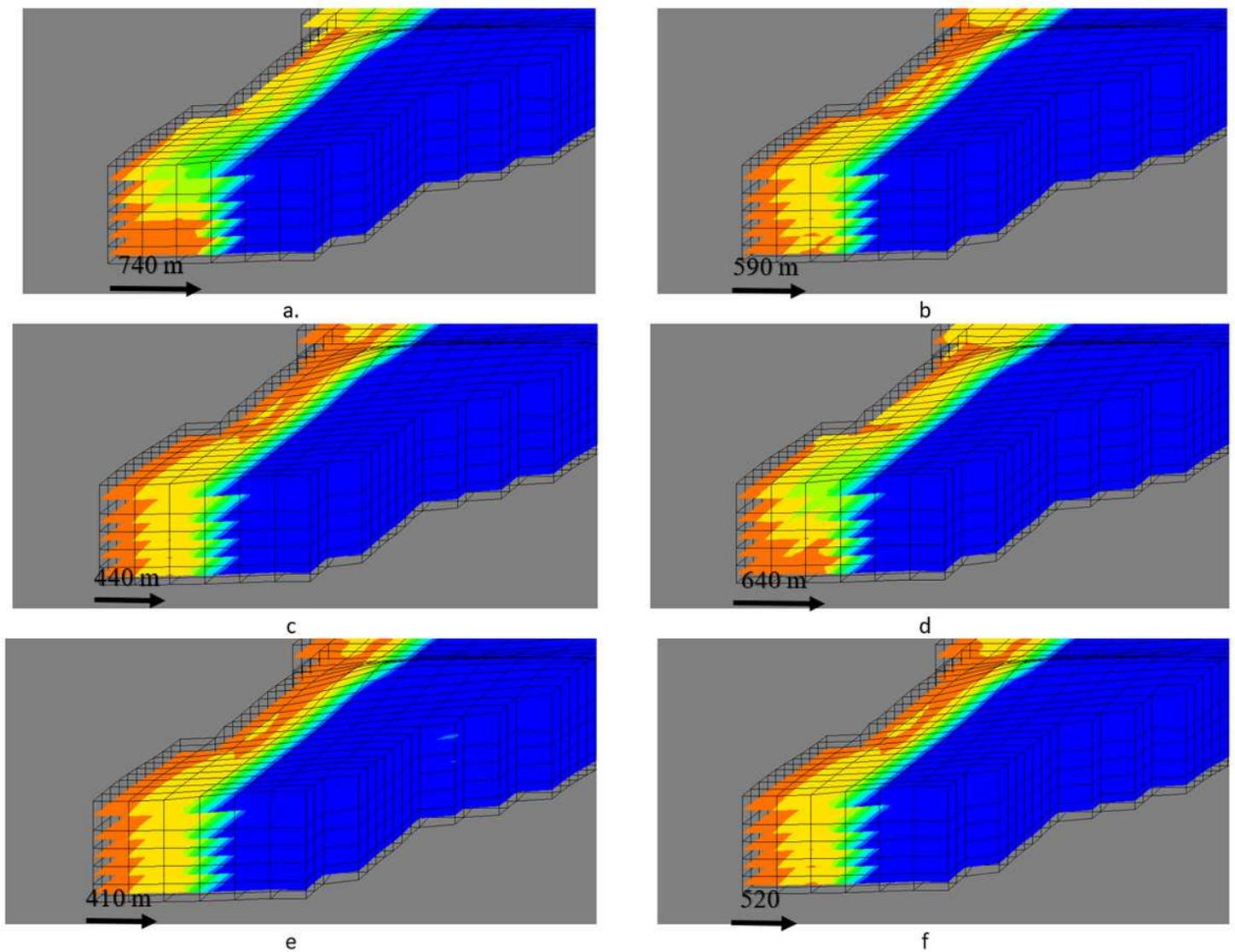


Figure 7

Results of saltwater intrusion by SEAWAT model from the sea for the all strategies: a) Business as usual b) Artificial recharge c) Underground dam d) 5% Exploitation reduction e) Underground dam + Artificial recharge f) 5% Exploitation reduction + artificial recharge

Scenarios	The weight of the qualitative sustainability index						
	0.8	0.7	0.6	0.5	0.4	0.3	0.2
5% reduction		0.14	0.22	0.27	0.31	0.35	0.39
10% reduction	0.08	0.12	0.14	0.17	0.19	0.21	0.22
Artificial recharging	0.06	0.17	0.24	0.29	0.33	0.37	0.40
Undreground dam	0.23	0.23	0.22	0.22	0.22	0.22	0.22
5% reduction+A.R	0.11	0.13	0.16	0.17	0.19	0.21	0.22
10% reduction+A.R	0.08	0.08	0.09	0.10	0.10	0.11	0.11
5% reduction+U.dam	0.15	0.14	0.13	0.11	0.10	0.08	0.05
10% reduction+U.dam	0.10	0.09	0.08	0.07	0.06	0.05	0.03
5% reduction+U.dam+A.R	0.24	0.19	0.10				
10% reduction+U.dam+A.R	0.24	0.19	0.13				
15% reduction+U.dam+A.R	0.14	0.11	0.08	0.02			
Artificial recharge+underground dam	0.29	0.25	0.20	0.14			

No enter to game model

Figure 8

Sensitivity analysis of the weight of qualitative sustainability and sustainability cost indices

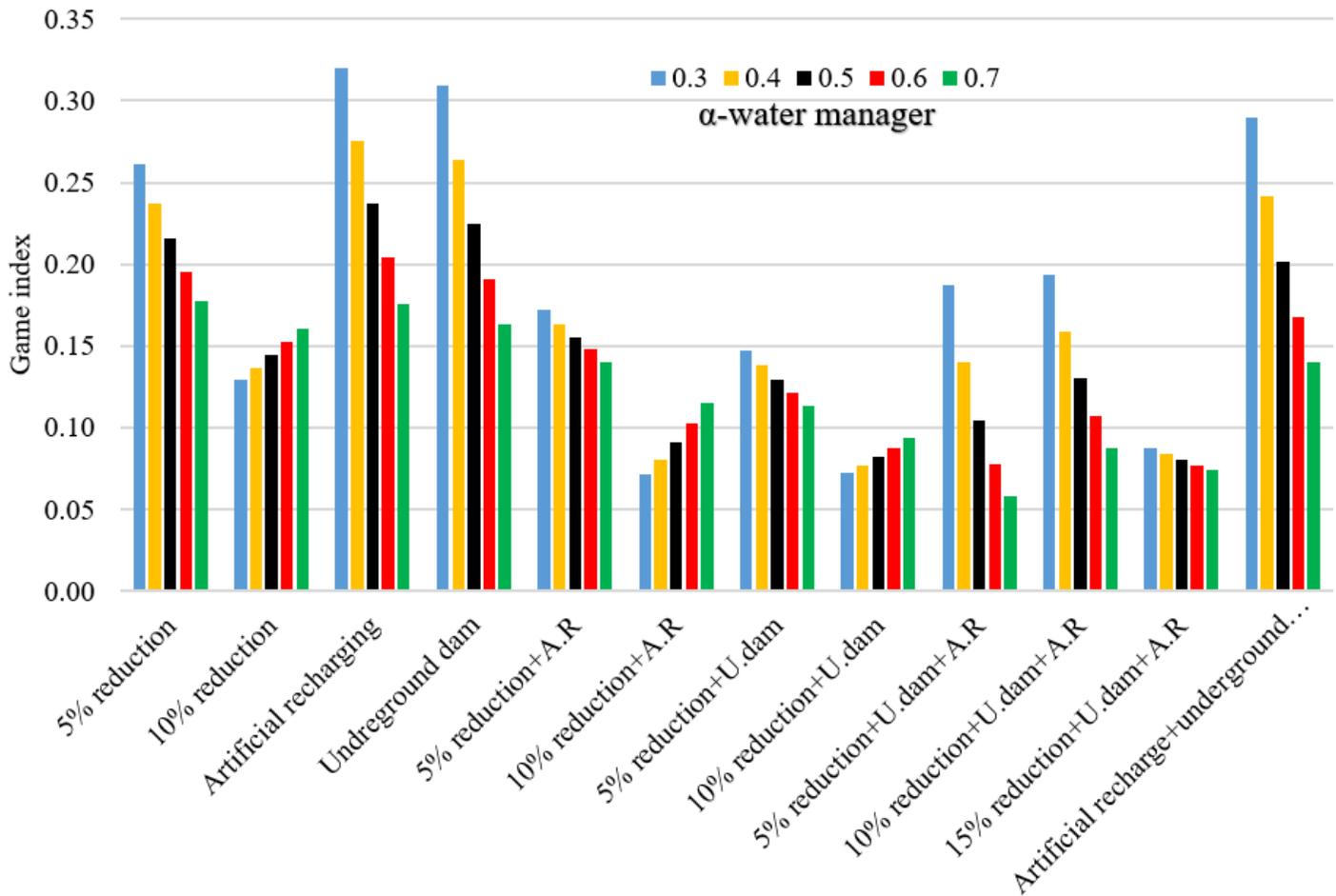


Figure 9

The sensitivity analysis of the relative power of the government in the conflict resolution model

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